# Algorithmic Graph Theory: How hard is your combinatorial optimization problem? 

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Lecture 9

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## Outline

## (1) Parameterized Problems <br> W-Hierarchy Designing Parameterized Algorithms

## Definition

A parameterized problem is a pair $(\Pi, \kappa)$, where $\Pi$ is a decision problem with set of instances $\mathcal{I}$ and $\kappa: \mathcal{I} \rightarrow \mathbb{N}$ a so-called parameter, a in polynomial time (in the size of $\mathcal{I}$ ) computable function.

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Parameterized problems are denoted by "p-" if parameterized by its "objective".

Example (p-VERTEX COVER)
Given: $G=(V, E)$ and integer $k \in \mathbb{N}$
Parameter: $k$
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## Example (p-tw-INDEPENDENT SET)

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Parameter: $\operatorname{tw}(G)$
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Given: Graph $G=(V, E)$ of bounded treewidth and integer $k \in \mathbb{N}$
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Let $(\Pi, \kappa)$ be a parameterized problem, $\mathcal{I}$ its set of instances.

- An algorithm $A$ is called fixed parameter tractable (FPT) w.r.t. a parameter $\kappa$, if there exists a computable function $f: \mathbb{N} \rightarrow \mathbb{N}$ and a polynomial $p$, such that for every instance $I \in \mathcal{I}$, the running time of $A$ is bounded by

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## Theorem

$p-T R E E W I D T H \in \mathcal{F P \mathcal { T }}$

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## $p$-VERTEX COVER $\mathcal{F P T}$

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LOG-VERTEX COVER can be solved in $O\left(n^{2}\right)$
Note: Every problem $\Pi \in \mathcal{P}$ is with every parameterization $\kappa$ in $\mathcal{F P \mathcal { T }}$. Note: Instead of multiplication, FPT can also be defined equivalently by

$$
f(\kappa(I))+p(|I|)
$$

or the combination

$$
g(\kappa(I))+f(\kappa(I)) \cdot p(|I|+\kappa(I)) .
$$

## RWTH AACHEN <br> UNIVERSTY

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## CLEMS?

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Prove that no FPT-algorithm can exist, unless $\mathcal{P}=\mathcal{N} \mathcal{P}$.

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Let $(\Pi, \kappa)$ be a parameterized problem and $k \in \mathbb{N}$. Then, the $k$-th slice of $(\Pi, \kappa)$ is the classical decision problem $\Pi$ restricted to the instances $/$ having $\kappa(I)=k$.

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Example (p-PARTITION IN INDEPENDENT SETS)
Given: $G=(V, E)$, integer $k \in \mathbb{N}$.
Parameter: $k$
Question: Does $V$ have a partition in $k$ independent sets?

## Theorem

Let $(\Pi, \kappa)$ be a parameterized problem and $k \in \mathbb{N}$. Is $(\Pi, \kappa)$ fixed parameter tractable, then the $k$-th slice $(\Pi, \kappa)$ can be solved in polynomial time.

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Unless $\mathcal{P}=\mathcal{N} \mathcal{P}$, p-PARTITION IN INDEPENDENT SETS $\notin \mathcal{F P} \mathcal{T}$.

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Unless $\mathcal{P}=\mathcal{N} \mathcal{P}$, p-PARTITION IN INDEPENDENT SETS $\notin \mathcal{F P} \mathcal{T}$.
Note: If all slices can be solved in polynomial time, it is not yet clear that the problem is in $\mathcal{F P \mathcal { T }}$.

## Example

## Example (p-INDEPENDENT SET)

Given: Graph $G=(V, E)$ and integer $k \in \mathbb{N}$
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Algorithm mis 1(G).
Input: Graph \(G=(V, E)\).
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    if \(|V|=0\) then
        return 0
    choose a vertex \(v\) of minimum degree in \(G\)
    return \(1+\max \{\operatorname{mis} 1(G \backslash N[y]): y \in N[v]\}\)
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Fig. 1.2 Algorithm misi for MaXimum Independent Set

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If $k$ is added, a running time of $O\left((\Delta(G)+1)^{k} n\right)=O(p(n))$ can be achieved (for fixed $k$ ).
This is not an FPT-algorithm! $(f(k)$ depends on $\Delta(G))$

## Example (p-deg-INDEPENDENT SET)

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Corollary p-deg-INDEPENDENT SETE \(\mathcal{F P} \mathcal{T}\)
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Let $(\Pi, \kappa)$ be a parameterized problem with $\mathcal{I}$ the set of instances.

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- $\mathcal{X P}$ defines the set of all parameterized problems for which an $\mathcal{X} \mathcal{P}$-algorithm exists.

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## Theorem

p-INDEPENDENT SET $\mathcal{X} \mathcal{P}$

## Outline

## (7) Parameterized Problems <br> (2) W-Hierarchy <br> Designing Parameterized Algorithms

Can we distinguish between $\mathcal{F P} \mathcal{T}$ and $\mathcal{X} \mathcal{P}$ in more detail?

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Yes, we can!

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A parameterized problem $\left(\Pi_{1}, \kappa_{1}\right)$ reduces parameterized to a parameterized problem $\left(\Pi_{2}, \kappa_{2}\right)$ if there exists a function $r: \mathcal{I}_{1} \rightarrow \mathcal{I}_{2}$ such that

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- p-INDEPENDENT SET reduces parameterized to p-CLIQUE

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Theorem
Let \(\left(\Pi_{1}, \kappa_{1}\right)\) and \(\left(\Pi_{2}, \kappa_{2}\right)\) be parameterized problems. If \(\left(\Pi_{1}, \kappa_{1}\right)\) reduces parameterized to \(\left(\Pi_{2}, \kappa_{2}\right)\), and \(\left(\Pi_{2}, \kappa_{2}\right) \in \mathcal{F P} \mathcal{T}\), then \(\left(\Pi_{1}, \kappa_{1}\right) \in \mathcal{F P} \mathcal{T}\).
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## Definition (p-WEIGHTED SAT)

Given: a boolean formula and integer $k \in \mathbb{N}$
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Question: Is the boolean formula satisfiable with at least $k$ variables set to TRUE?

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## Definition (WEIGHTED WEFT-t-DEPTH-d SAT)

Given: A Boolean formula of depth at most $d$ and weft at most $t$, and a number $k$. The depth is the maximal number of gates on any path from the root to a leaf, and the weft is the maximal number of gates of fan-in at least three on any path from the root to a leaf.
Question: Is the boolean formula satisfiable with $k$ variables set to TRUE?


Boolean circuit with weft $=3$ and depth $=5$

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## Definition

The W-Hierarchy consists of the complexity classes $W[t], t \geq 1$. A parameterized problem $(\Pi, \kappa)$ is a member of $W[t]$ if it can be reduced parameterized to p-WEIGHTED WEFT-t-DEPTH- $d$ SAT for some $d \in \mathbb{N}$.

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Example p-INDEPENDENT \(S E T \in W[1]\)
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Example p -INDEPENDENT \(\mathrm{SET} \in W\) [1]
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## Example p -CLIQUE $\in W[1]$

## Example (p-DOMINATING SET)

Given: Graph $G=(V, E)$, integer $k \in \mathbb{N}$
Parameter: $k$
Question: Does $G$ have a dominating set of size at most $k$, i.e., a subset of the vertices $S \subseteq V$ such that for all vertices $v \in V: N[v] \cap S \neq \emptyset$.

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## Lemma

p-DOMINATING SET $\mathcal{W}$ [2]

## $W[t]$-Completeness

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Corollary: p-WEIGHTED WEFT- $t$-DEPTH- $d$ SAT is $W[t]$-complete (by definition).

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## Theorem

- p-INDEPENDENT SET and p-CLIQUE are W[1]-complete


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## Theorem

- p-INDEPENDENT SET and p-CLIQUE are W[1]-complete
- p-DOMINATING SET is W[2]-complete


## Theorem

For every $t \geq 1, W[t]=\mathcal{F P \mathcal { T }}$ if and only if a $W[t]$-hard problem is a member of $\mathcal{F P \mathcal { T }}$.

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## (1) Parameterized Problems W-Hierarchy <br> (3) Designing Parameterized Algorithms

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## Definition

Let $(\Pi, \kappa)$ be a parameterized problem with $\mathcal{I}$ the set of instances of $\Pi$. A in polynomial time computable function $f: \mathcal{I} \times \mathbb{N} \rightarrow \mathcal{I} \times \mathbb{N}$ is called kernelization for $(\Pi, \kappa)$ if $\left(I^{\prime}, \kappa\left(I^{\prime}\right)\right)=f(I, \kappa(I))$ satisfies the following three properties:

Idea: reduce an instance $I$ to an instance $I^{\prime}$ which size only depends on the parameter, not on the original instance size

## Definition

Let $(\Pi, \kappa)$ be a parameterized problem with $\mathcal{I}$ the set of instances of $\Pi$. A in polynomial time computable function $f: \mathcal{I} \times \mathbb{N} \rightarrow \mathcal{I} \times \mathbb{N}$ is called kernelization for $(\Pi, \kappa)$ if $\left(I^{\prime}, \kappa\left(I^{\prime}\right)\right)=f(I, \kappa(I))$ satisfies the following three properties:

1. For all $I \in \mathcal{I},(I, \kappa(I))$ is a "yes"-instance if and only if $\left(I^{\prime}, \kappa\left(I^{\prime}\right)\right)$ a "yes"-instance of $\Pi$

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The instance $I^{\prime}$ is called kernel of $(\Pi, \kappa)$ and $f^{\prime}(\kappa(I))$ is called the size of the kernel.

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Example: p-VERTEX COVER

2 Reduction rules:

## Lemma

Let $G=(V, E)$ be a graph and $v \in V$ a vertex of degree 0 . $G$ has a vertex cover of size $k$, if and only if $G-v$ has a vertex cover of size $k$.

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## Lemma

Let $G=(V, E)$ be a graph without isolated vertices. If $G$ has a vertex cover of size at most $k$ and $\Delta(G) \leq d$, then $G$ has at most $k(d+1)$ vertices.

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p-VERTEX COVER has a kernel of size at most $k(k+1)$, where $k$ is the parameter of the problem.

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Corollary
p-VERTEX COVER $F$ FPT

FPT algorithm for p-VERTEX COVER

1. $(G, k) \rightarrow(G-v, k-1)$ for all vertices $v$ of degree $>k$

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## Theorem

The FPT-algorithm for p-VERTEX COVER decides for every graph $G$ with $n$ vertices in $O\left(k n+k^{2 k}\right)$ whether $G$ has a vertex cover of size at most $k$.

## Lemma

Let $G=(V, E)$ be a graph and $v \in V$ a vertex of degree 1 with neighbor $w$. $G$ has a vertex cover of size $k$ if and only if $G-\{v, w\}$ has a vertex cover of size $k-1$.

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Search trees of limited height: Example p-VERTEX COVER (earlier)

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VC3 If $v$ is a vertex of degree at least 3, then either $v$ or all its neighbors are part of the vertex cover: branch into $(G-v, k-1)$ and $(G-N(v), k-|N(v)|)$.

RWTHACHEN

## Further FPT Techniques

Search trees of limited height: Example p-VERTEX COVER (earlier) 3 rules:

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## Theorem

The search tree defined by VC1, VC2, and VC3 for p-VERTEX COVER has a size of $O\left(1.47^{k}\right)$.

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A combination of kernelization and search tree is also possible.

# Algorithmic Graph Theory: How hard is your combinatorial optimization problem? 

Arie M.C.A. Koster

Lecture 9

Clemson, June 13, 2017


