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

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## Lecture 9

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**RWTHAACHEN** UNIVERSITY





#### Parameterized Problems

W-Hierarchy Designing Parameterized Algorithms

A parameterized problem is a pair  $(\Pi, \kappa)$ , where  $\Pi$  is a decision problem with set of instances  $\mathcal{I}$  and  $\kappa : \mathcal{I} \to \mathbb{N}$  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".

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Example (p-VERTEX COVER)
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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 κ, if there exists a computable function f : N → N and a polynomial p, such that for every instance l ∈ I, the running time of A is bounded by

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#### Theorem

 $p\text{-}TREEWIDTH \in \mathcal{FPT}$ 





## *p*-VERTEX COVER $\in \mathcal{FPT}$

# Examples

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Given: G = (V, E)

Question: Does G have a vertex cover of size at most  $\log |V|$ ?

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Note: Every problem  $\Pi \in \mathcal{P}$  is with every parameterization  $\kappa$  in  $\mathcal{FPT}$ . Note: Instead of multiplication, FPT can also be defined equivalently by

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

or the combination

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

Examples



k-th Slice of a problem

How can we show a problem is in  $\mathcal{FPT}$ ?



k-th Slice of a problem

#### How can we show a problem is in $\mathcal{FPT}$ ?

Find a FPT-algorithm!



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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 *l* having  $\kappa(l) = k$ .



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



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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## Corollary

Unless  $\mathcal{P} = \mathcal{NP}$ , p-PARTITION IN INDEPENDENT SETS  $\notin \mathcal{FPT}$ .

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.

## Corollary

 $\textit{Unless } \mathcal{P} = \mathcal{NP}, \textit{ p-PARTITION IN INDEPENDENT SETS} \notin \mathcal{FPT}.$ 

Note: If all slices can be solved in polynomial time, it is not yet clear that the problem is in  $\mathcal{FPT}$ .





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Given: Graph G = (V, E) and integer  $k \in \mathbb{N}$ Parameter: kQuestion: Does G have an independent set of size at least k?

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Parameter: k

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Algorithm mis1(G).

Input: Graph G = (V, E).

Output: The maximum cardinality of an independent set of G.

if |V| = 0 then

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choose a vertex v of minimum degree in G

return 1 + \max\{\min i (G \setminus N[y]) : y \in N[v]\}
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Fig. 1.2 Algorithm mis1 for MAXIMUM INDEPENDENT SET



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Fig. 1.2 Algorithm <code>mis1</code> for MAXIMUM INDEPENDENT SET

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

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#### Theorem

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## Parameterized Problems

W-Hierarchy

Designing Parameterized Algorithms








Yes, we can!



W-Hierarchy

Can we distinguish between  $\mathcal{FPT}$  and  $\mathcal{XP}$  in more detail?

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A parameterized problem  $(\Pi_1, \kappa_1)$  reduces parameterized to a parameterized problem  $(\Pi_2, \kappa_2)$  if there exists a function  $r : \mathcal{I}_1 \to \mathcal{I}_2$  such that

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- p-INDEPENDENT SET reduces parameterized to p-CLIQUE



### Theorem

Let  $(\Pi_1, \kappa_1)$  and  $(\Pi_2, \kappa_2)$  be parameterized problems. If  $(\Pi_1, \kappa_1)$  reduces parameterized to  $(\Pi_2, \kappa_2)$ , and  $(\Pi_2, \kappa_2) \in \mathcal{FPT}$ , then  $(\Pi_1, \kappa_1) \in \mathcal{FPT}$ .



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# Definition (p-WEIGHTED SAT)

Given: a boolean formula and integer  $k \in \mathbb{N}$ 

Parameter: k

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





### Definition

The W-Hierarchy consists of the complexity classes W[t],  $t \ge 1$ . 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 SET W[1]



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p-INDEPENDENT SET  $\in W[1]$ 

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 $p-CLIQUE \in W[1]$ 

Example (p-DOMINATING SET) Given: Graph G = (V, E), integer  $k \in \mathbb{N}$ Parameter: kQuestion: 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∈ W[2]



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- A parameterized problem (Π, κ) is W[t]-complete if it is W[t]-hard and a member of W[t] itself.

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

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■ *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  $t \ge 1$ ,  $W[t] = \mathcal{FPT}$  if and only if a W[t]-hard problem is a member of  $\mathcal{FPT}$ .





# Parameterized Problems

N-Hierarchy

Designing Parameterized Algorithms





### Definition

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- 1. For all  $I \in \mathcal{I}$ ,  $(I, \kappa(I))$  is a "yes"-instance if and only if  $(I', \kappa(I'))$  a "yes"-instance of  $\Pi$
- 2. There exists a function  $f': \mathbb{N} \to \mathbb{N}$  such that  $|I'| \leq f'(\kappa(I))$



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- 3.  $\kappa(I') \leq \kappa(I)$



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- 3.  $\kappa(I') \leq \kappa(I)$

The instance I' is called kernel of  $(\Pi, \kappa)$  and  $f'(\kappa(I))$  is called the size of the kernel.



# Definition

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

- 1. For all  $I \in \mathcal{I}$ ,  $(I, \kappa(I))$  is a "yes"-instance if and only if  $(I', \kappa(I'))$  a "yes"-instance of  $\Pi$
- 2. There exists a function  $f': \mathbb{N} \to \mathbb{N}$  such that  $|I'| \leq f'(\kappa(I))$
- 3.  $\kappa(I') \leq \kappa(I)$

The instance I' is called kernel of  $(\Pi, \kappa)$  and  $f'(\kappa(I))$  is called the size of the kernel.

# Example: p-VERTEX COVER

# 2 Reduction rules:

### Lemma

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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.

### Lemma

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

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- 4. If  $|V| \le k(k+1)$ , then enumerate all subsets *S*, and check on vertex cover, take the smallest.

If  $|S| \leq k$ , then **return** "Yes" else **return** "No"



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  - If  $|S| \leq k$ , then **return** "Yes" else **return** "No"

### Theorem

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



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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p-VERTEX COVER has a kernel of size at most 2k



VC1 If v is a vertex of degree 1, add  $w \in N(v)$  to the vertex cover; continue with (G - w, k - 1)

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#### Theorem

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

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### Theorem

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

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





**RWTHAACHEN** UNIVERSITY