

# Parameterized Complexity - an Overview

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## Outline

- 1 Approaches to NP hard problems
- 2 Fixed parameter tractability
- 3 Detailed example
- 4 Parametric intractability
- 5 Classical and algebraic complexities



## Introduction

Many important problems in computer science, engineering, mathematics are unfortunately *NP-hard* problems

Heuristics, parallel algorithms (branch'n'bound), approximation schemes, randomized algorithms are important aspects in order to solve many hard problems

*Fixed Parameter Tractability* is yet another approach to combat intractability of important problems. Originally introduced by Downey and Fellows

## Heuristics

*Good news:* Good running time, (often) good solutions, uses techniques that makes sense for the given problem

*Bad news:* Often no knowledge about quality of solution (of course, the solution might be better than previously best known solution), few mathematical results

## Parallel algorithms (b'n'b)

*Good news:* We get the exact/optimal solution, many combinatorial search problems easy to parallelize, computing power quite cheap

*Bad news:* Exponential running time (large cluster/botnet required), not applicable to really large instances

## Approximation algorithms

*Good news:* Polynomial running time, knowledge about quality of solution

*Bad news:* We rarely get the optimal solution, many problems cannot be approximated very well (e.g. CLIQUE), some PTAS's are impractical

## Fixed parameter tractable

*Good news:* We get the exact/optimal solution

*Bad news:* Worst case exponential running time... But, WAIT!

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## General idea

Fixed Parameter Tractability is a design paradigm where we take into account, that for many "real life" problems we know in advance, that some part of the instance will be small

With the assumption that a certain part of the instance (the parameter) is small, we want to develop efficient (polynomial time) algorithms

While a problem in general might be intractable, not all *instances* of that problem need to be intractable. Framework to analyse which instances are (in)tractable

## Example: Database Queries

Consider evaluating a sentence of some language (a query) in a given finite structure (a database)

In *general* this is of high complexity, but typical queries are *much simpler* (delete \* from students where average < "D")

Thus, we should put more focus on simple queries in large databases, than on complex queries in general. If query complexity  $k$  is small and database size  $n$  is large, then  $O(2^k \cdot n)$  is better than  $O(n^k)$

Parameterized complexity provides a framework to study this

## The parameter

Typical parameters are:

- Number of variables in a *SAT* instance
- Number of clauses in a *SAT* instance
- Treewidth/pathwidth/cliquewidth of a graph
- Size of vertex cover/cliقة/dominating set of a graph

A problem can have multiple parameterizations, each leading to different results

## Class *FPT*

A parameterized language  $L$  is a subset of  $\Sigma^* \times \Sigma^*$ , where  $\Sigma$  is a finite alphabet. Let  $(x, k) \in L$ , then we call  $x$  the *main part* and  $k$  the *parameter*. Often  $k$  is an integer

$L \in FPT$  if it can be decided in time  $f(k) \cdot |x|^{O(1)}$  (or  $f(k) + |x|^{O(1)}$ ) for an *arbitrary* function  $f$  (typically exponential at least)

For a fixed  $k$  it is in  $P$ , moreover for every  $k$  it is in the *same* polynomial class via the *same* machine

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## Example: VERTEX COVER

Parameter  $k$  is the size of the vertex cover we are looking for

Straight forward  $O(n^k)$  approach does not lead to *FPT* algorithm

Instead we split the algorithm into two parts (this approach due to Sam Buss):

- Reduction of the graph to a *problem kernel* - a graph of size  $O(k^2)$
- Brute force search to solve the reduced problem instance

## Part 1: Kernelization

Repeat the following rules as many times as possible:

- If  $G$  has a vertex of degree  $> k$ , include it in cover
- If  $G$  has a vertex of degree 0, exclude it from cover

Let  $k'$  be  $k$  minus number of vertices included in this step  
If we end up with a graph with more than  $k' \cdot (k + 1)$  vertices, then reject

Running time is  $O(k \cdot n)$

## Part 2: Search tree

Create a search tree of height at most  $k'$

Choose any remaining vertex  $v$  and branch as follows:

- Include  $v$  in cover
- Exclude  $v$  from cover, but include all its neighbors

Explore exhaustively all paths in this search tree for a vertex cover of size  $k'$ . Eventually either accept or reject

Running time  $O(2^k)$



## Improved algorithm

*Kernelization*: Additional rules to remove vertices of degree 1, 2 or 3

*Search tree*: Use degree bounds to construct smaller tree. More involved than idea given here

Total running time becomes  $O(k \cdot n + 1.286^k)$

Implementation shows it is *practical* for graphs of arbitrary size and  $k \leq 400$

## FPT roundup

Analysis of running time now done with respect to two variables:  
Size of input and size of parameter

Size of parameter contributes only as a multiplicative factor, *not* to the degree

*Kernelization* followed by brute force search is an important technique

It is *good news* that a problem can have more than one parameterization, however there is *bad news* as well...

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## Parametric intractability

Intractability is (as usual) shown by means of *hardness* for a certain complexity class

Consider the following classical problem:

### NONDETERMINISTIC TURING MACHINE ACCEPTANCE

Input: A nondeterministic Turing machine  $M$

Question: Does  $M$  have an accepting computation in  $\leq |M|$  steps?

*Conjecture:* This problem is intractable. The behavior of a Turing machine in general is so complex, that we cannot decide if it accepts without inspecting all computation paths

## Parametric intractability

Downey and Fellows conjectured that the equivalent *parameterized* version would be intractable also

### SHORT NONDETERMINISTIC TURING MACHINE ACCEPTANCE

- Input: A nondeterministic Turing machine  $M$
- Parameter: A positive integer  $k$
- Question: Does  $M$  have an accepting computation in  $\leq k$  steps?

Straight forward  $O(|M|^k)$  approach does not lead to *FPT* algorithm

*Note:* If the number of states in  $M$  is bounded by a constant, the problem is in *FPT*

## Reductions

A parameterized reduction is a transformation from one parameterized language  $L$  to another parameterized language  $L'$ .

We require the following to be satisfied:

- $(x, k) \in L$  iff  $(x', k') \in L'$
- $k' = g(k)$ , depends *only* on the parameter and *not* on the main part
- $x'$  can be computed in time  $f(k) \cdot |x|^{O(1)}$
- Functions  $f$  and  $g$  only depends on the problems

As usual, if  $L$  reduces to  $L'$  and  $L' \in FPT$ , then  $L \in FPT$  as well

*Note:* Karp reductions are rarely parameterized reductions (the reduction between CLIQUE and INDEPENDENT SET being an exception)

## The $W[t]$ -hierarchy

$$FPT \subseteq W[1] \subseteq W[2] \subseteq W[3] \subseteq \dots$$

The  $W[t]$ -hierarchy is based on a modified CIRCUIT SATISFIABILITY problem:

- *Small gate*: Constant fan-in
- *Large gate*: Arbitrary fan-in, depending on the instance
- *Depth*: Max number of gates on an input-output path
- *Weft*: Max number of *large* gates on an input-output path

## The $W[t]$ -hierarchy

$W[1]$ : The class of languages that can be reduced to a family of constant depth, *weft* 1 circuits, such that the produced circuit has a *weight*  $k'$  satisfying assignment iff the original instance satisfies  $(x, k) \in L$

For all classes in the  $W[t]$ -hierarchy the *parameter* is always the same: The *weight* of the satisfying assignment

The difference between the classes in the  $W[t]$ -hierarchy is the *weft* of the circuit



## Ex.: INDEPENDENT SET

Hardness for  $W[1]$  is an involved proof (not shown here). Instead membership in  $W[1]$  will be illustrated:

- Each vertex in  $G$  corresponds to one input gate in the circuit
- For every edge  $(v, u)$  in  $G$  we build a *small* OR-gate of constant fan-in 2:  $(\neg v \vee \neg u)$
- Output from small gates are given as input to a single *large* AND-gate

$G$  has an independent set of size  $k$  iff this circuit has a satisfying assignment of weight  $k$

Unlike  $NP$ -hardness results,  $W[1]$ -hardness for SHORT TURING MACHINE ACCEPTANCE uses INDEPENDENT SET and CLIQUE as intermediate results

Note: DOMINATING SET is  $W[2]$ -complete

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## Classical complexity

Some connections to classical complexity theory:

$FPT \neq W[1]$  implies  $P \neq NP$

$FPT = W[1]$  implies 3SAT solvable in time  $2^{o(n)}$

Not known if  $FPT = W[1]$  implies anything about the rest of the  $W[t]$ -hierarchy

Practical intractability of problems in  $NP$ , which are unlikely to be complete for  $NP$ , can be shown using  $W[t]$ -hardness results

## Algebraic complexity

The class  $FPT$  can easily be transferred to the Blum-Shub-Smale (BSS) model of computation over the real numbers

However, more than one natural way to consider a possible  $W[t]_{\mathbb{R}}$ -hierarchy, depending on parameter:

- Number of variables: If only equalities are allowed we can square and sum to get a single polynomial, and thus in  $FPT_{\mathbb{R}}$  due to Renegar. If inequalities are allowed it seems intractable
- Number of non-zero values in a satisfying assignment: Seems intractable

## Algebraic complexity

Different hierarchies can be constructed depending on whether large gates can be algebraic or only boolean

In the discrete setting, parameterizing by the number of variables in a *SAT* instance leads to an *FPT* result. In the real number setting, parameterizing by the number of variables in a polynomial system may not give an  $FPT_{\mathbb{R}}$  result

In the BSS model nondeterminism was introduced using certificate checkers. Parameterizing by number of steps gives an  $FPT_{\mathbb{R}}$  result

Merci!

