

Parameterized Complexity – An Overview

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CC61X: Diseño y Analisis de Algoritmos Adaptivos

- 1 Introduction to Parameterized Complexity
 - Motivation
 - Examples of parameters
 - Main Complexity Classes
- 2 FPT Algorithms
 - Vertex Cover: definition and example
 - General Argument by Graph Minors
 - Algorithms for Vertex Cover
- 3 W-Hardness
 - Comparison: classical vs. parameterized hardness reduction
 - Induced Biclique: example and definition
 - Induced Biclique is $W[1]$ -hard
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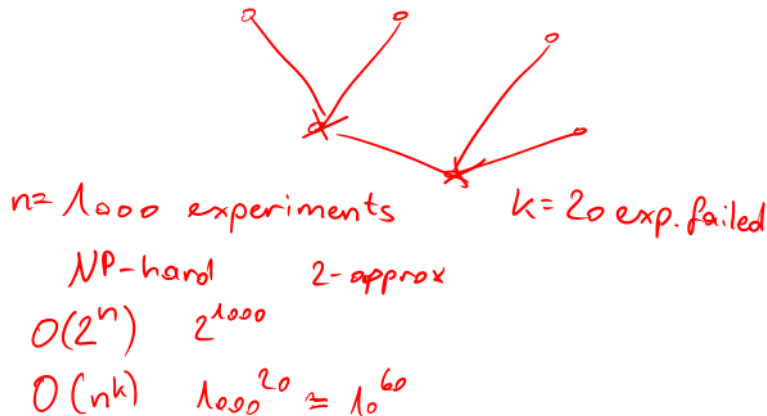
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A story

A computer scientist meets a biologist ...



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Eliminating conflicts from experiments

$n = 1000$ experiments

$k = 20$ experiments failed

Theoretical	Running Time	
	Nb of Instructions	Real
2^n	$1.07 \cdot 10^{301}$	$3.16 \cdot 10^{285}$ years
n^k	10^{60}	$2.95 \cdot 10^{44}$ years
$2^k \cdot n$	$1.05 \cdot 10^9$	0.97 seconds

Notes:

- We assume that 2^{30} instructions are carried out per second.
- The Big Bang happened roughly $13.5 \cdot 10^9$ years ago.

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Goal of Parameterized Complexity

Confine the combinatorial explosion to a parameter k .



For which problem–parameter combinations can we find algorithms with running times of the form

$$f(k) \cdot n^{O(1)},$$

where the f is a computable function independent of the input size n ?

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Examples of Parameters

A **PARAMETERIZED** PROBLEM

- Input: an instance of the problem
- **Parameter: a parameter**
- Question: a Yes–No question about the instance and the parameter

- A parameter can be
 - solution size
 - input size (trivial parameterization)
 - related to the structure of the input (maximum degree, treewidth, branchwidth, genus, ...)
 - etc.



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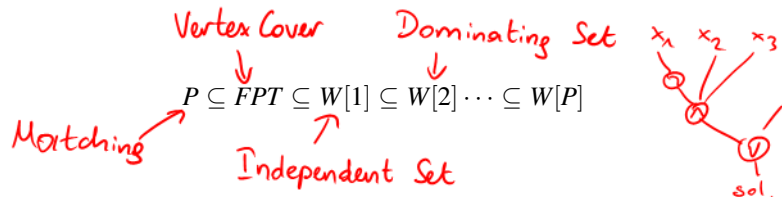
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Main Complexity Classes

P : class of problems that can be solved in time $n^{O(1)}$

FPT : class of problems that can be solved in time $f(k) \cdot n^{O(1)}$

$W[\cdot]$: parameterized intractability classes



Known: If $FPT = W[1]$, then the Exponential Time Hypothesis fails, i.e. 3-SAT can be solved in time $O(2^{\epsilon \cdot n})$ for every $\epsilon > 0$.

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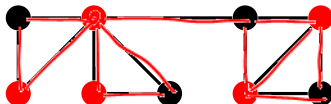
Vertex Cover

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VERTEX COVER (VC)

- Input: A graph $G = (V, E)$ on n vertices, an integer k .
- Parameter: k
- Question: Is there a set of vertices $C \subseteq V$ of size at most k such that every edge has at least one endpoint in C ?



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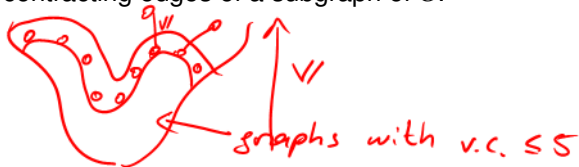
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General Argument by Graph Minors

Well-quasi-ordering: reflexive and transitive ordering which has no infinite antichain (any set of pairwise incomparable objects is finite)

$$H \leq G \quad G \leq J \Rightarrow H \leq J \quad // \quad G \leq G$$

Minor: A graph H is a minor of a graph G if H can be obtained by contracting edges of a subgraph of G .



By Robertson, Seymour:

- finite graphs are well quasi ordered under taking minors
- checking whether H is a minor of G can be done in time $f(|H|) \cdot |G|^{O(1)}$

→ any graph problem whose Yes-instances (or No-instances) are closed under taking minors is FPT.

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Graph Minor argument applied to VC



Yes-instances of VC are closed under taking minors.

Let G be a graph and C be a vertex cover of size $\leq k$ of G .

- if H is obtained from G by removing an edge, then C is a v.c. of size $\leq k$ of H
- if H is obtained from G by removing a vertex, ...
- if H is obtained from G by contracting an edge, ...

Thus, $VC \in FPT$.

But: this argument does not give us an FPT algorithm, as the proofs are not constructive.

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Brute Force Algorithms

- $2^n \cdot n^{O(1)}$ not FPT
- $n^k \cdot n^{O(1)}$ not FPT

2^n - algorithm checking all subsets

$$\underline{f(k)} \cdot \text{poly}(n)$$

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An FPT Algorithm

Algorithm $\text{vc1}(G, k)$;

Input : A graph $G = (V, E)$, an integer $k \geq 0$

Output: Yes if G has a vertex cover of size $\leq k$,
No otherwise.

```
1 if  $E = \emptyset$  then                // all edges are covered
2   | return Yes
3 else if  $k = 0$  then              // we used too many vertices
4   | return No
5 else
6   | Select an edge  $uv \in E$ ;
7   | return  $\text{vc1}(G - u, k - 1)$   $\vee \text{vc1}(G - v, k - 1)$ 
```



- Running time?

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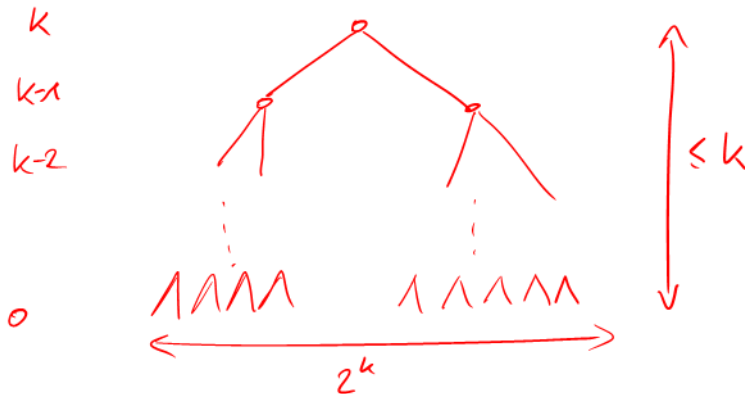
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Running Time of Algorithm vc1



$2^k \cdot \text{poly}(n)$

can we decrease this?

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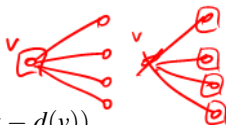
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A faster FPT Algorithm

Algorithm $\text{vc2}(G, k)$;

```
1 if  $E = \emptyset$  then                                // all edges are covered
2   return Yes
3 else if  $k = 0$  then                                // we used too many vertices
4   return No
5 else if  $\Delta(G) \leq 2$  then                        //  $G$  has maximum degree  $\leq 2$ 
6   Solve the problem in polynomial time;
7 else
8   Select a vertex  $v$  of maximum degree;
9   return  $\text{vc2}(G - v, k - 1) \vee \text{vc2}(G - N[v], k - d(v))$ 
```



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Exercise

Show that VC can be solved in polynomial time for graphs of maximum degree at most 2.



$P_n \rightarrow$ size of vertex cover is

$C_n \rightarrow$ size of vertex cover is



C is a v.c. containing u

$\rightarrow C' = (C \setminus \{u\}) \cup \{v\}$ is a v.c. of size $\leq |C|$

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Running Time of Algorithm vc2

v has degree ≥ 3



$$T(k) \leq T(k-1) + T(k-3)$$

$$x^k = x^{k-1} + x^{k-3} \quad | \cdot \frac{1}{x^{k-3}}$$

$$x^3 = x^2 + 1$$

$$x^3 - x^2 - 1 = 0 \quad \rightarrow \text{solve using Newton's method}$$

just one positive real root : $x \approx 1.4656\dots$

$\rightarrow$ running time is $1.4656^k \cdot \text{poly}(n)$

$$1.4656^k \cdot n^{O(1)}$$

$$(\text{Current best: } 1.2738^k \cdot n^{O(1)})$$

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Parameterized Reduction

Definition 1 (parameterized reduction)

A **parameterized** reduction is a transformation, taking as input an instance (I, k) of a problem Π_1 , and producing an instance (I', k') of a problem Π_2 in time $f(k) \cdot |I|^{O(1)}$ such that

- (I, k) is a Yes-instance for $\Pi_1 \iff (I', k')$ is a Yes-instance for Π_2
- $k' \leq g(k)$ for a function g

$$\begin{array}{ccc} \Pi_1 & \longrightarrow & \Pi_2 \\ (I, k) & \xrightarrow{\quad} & (I', k') \\ & \uparrow & \\ & \text{transformation done in time } f(k) \cdot |I|^{O(1)} & \\ \text{YES} & \iff & \text{YES} \\ k' & \leq & g(k) \end{array}$$

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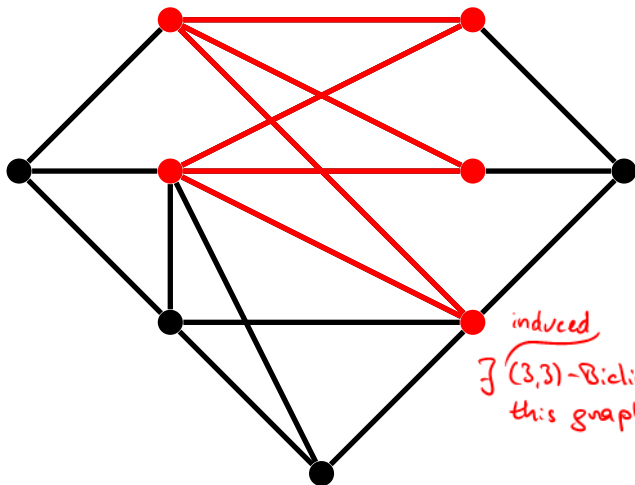
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Definition by example



induced
 $\{(3,3)$ -Biclique in this graph?

Induced $(2,3)$ -Biclique $B \subseteq V$.

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Definitions

solve IS. $\rightarrow$ use algo IB

INDUCED BICLIQUE (IB)

- Input: $G = (V, E)$, k .
- Parameter: k
- Question: Does G have an induced (k, k) -Biclique?

INDEPENDENT SET (IS)

- Input: $G = (V, E)$, k .
- Parameter: k
- Question: Does G have k pairwise non-adjacent vertices?

IS is a typical $W[1]$ -complete problem.

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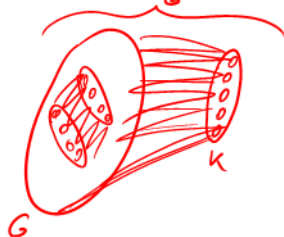
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Independent Set reduces to Induced Biclique

(G, k) instance for ind. set.



(G', k') instance for induced Biclique



k -ind. set in $G \Rightarrow$

ind. (k, k) -Biclique in G'

ind. (k, k) -Biclique in $G' \Rightarrow$

k -ind. set in G

Ind. Set reduces to Induced Biclique by
a parameterized Reduction.

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Exercise

k-Leaf Tree

In: $G=(V,E)$, integer k

Param: k

Qu: Does G have a subtree with $\geq k$ leaves

connected acyclic subgraph



$k=3$

L. $u \in V$. $\exists$ opt. sol. T st.
either u is a leaf in T or T contains all edges
incident to u

Proof



□

Task: Design a $4^k \cdot \text{poly}(n)$ time algorithm for
k-Leaf Tree

- Books

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