## UNIVERSITÄT WÜRZBURG

## Lehrstuhl für

INFORMATIK I
Algorithmen \& Komplexität

## Exact Algorithms

Sommer Term 2020
Lecture 10 Kernelization
Based on: [Parameterized Algorithms: §1, 2.1]
and [Gramm, Guo, Hüffner, Niedermeier; Theory Comput. Syst. 38:373-392, 2005.
doi.org/10.1007/s00224-004-1178-y]
(slides by J. Spoerhase, Th. van Dijk, S. Chaplick, and A. Wolff)

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Fixed-Parameter Tractability:

- In many applications, some aspect of a problem assumed small.
- Runtime of algorithm polynomial except for this small aspect.


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Problem: k-Vertex Cover (k-VC)
Given: graph $G$
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\Rightarrow \text { Not in FPT !!!! }
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\underset{\text { assuming FPT }}{\text { Requires }} \Omega\left(n^{f(k)}\right) \text { time } \ldots
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Evidence against Fixed-Parameter Tractability
Complexity classes $\mathrm{FPT} \subseteq \mathrm{W}[1] \subseteq \mathrm{W}[2] \ldots$
e.g. $\mathrm{FPT}=\mathrm{W}[1] \Rightarrow \mathrm{NP} \subseteq \mathrm{DTIME}\left(2^{o(n)}\right)$, contradicting ETH

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$\longrightarrow$ see Parameterized Algorithms §14.4

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Obs: If there are no edges, solution size 0 .
Obs: For each edge $u v$, either $u$ or $v$ in the cover.
Branching Rule:
Pick an edge $u v$, branch on ( $G-u, k-1$ ) and ( $G-v, k-1$ ).

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# Kernelisation 

Preprocessing with quality guarantees

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eg, recall: Buss' algorithm for $k$ - VC
I) Reduce to the kernel of the instance

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\begin{aligned}
& C=\{v \in V \mid \operatorname{deg}(v)>k\} ; \text { if }|C|>k \text { then return }(\text { "NO", } \emptyset) \\
& G^{\prime}=\left(V^{\prime}, E^{\prime}\right):=G[V \backslash(C \cup L)], k^{\prime}=k-|C| \quad(L=\text { isolated vertices }) \\
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So, we have an $f(k)$-size kernel.

## Typical Form of Kernelisation

Repeat some rules, until no rule is possible

- Rules can do some necessary modification and decrease $k$.
- Rules can remove some part of the graph.
- Rules can output YES or NO.
- Sometimes add 'annotations' to the graph


## Cluster Editing

Given: $\quad$ graph $G=(V, E)$
Parameter: number $k$
Question: $\quad$ Can we make $\leq k$ modifications to $G$ so that each connected component is a clique?
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Annotate the graph:
some pairs of vertices are permanent and others are forbidden.

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So, "small" components are fine but what if we have a "big" component?

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Exercise: Find a contradiction for the case $k=1$ !

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Analysis - Case 2
Case 2: $\quad a>0$

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Case 2A: $a=k$

Case 2B: $a<k$

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Note: $u$ has $\geq 2 k+1-a-1$ neighbors in $C$.

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Case 2B: $a<k \Rightarrow \exists u v \in E: u \in C, v \in V \backslash C$ Recall that $|C|>2 k+1$.


Note: $u$ has $\geq 2 k+1-a-\frac{?}{} 1$ neighbors in $C$. $v$ has $\leq d-1$ neighbors in $C \backslash\{u\}$.

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## Exercise:

## Analysis - Case 2

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Exercise: Find a simple branching rule for Cluster Editing!

