

Fine-Grained Complexity and Algorithm Design Boot Camp

## Parameterized Reductions

Dániel Marx

Institute for Computer Science and Control,  
Hungarian Academy of Sciences (MTA SZTAKI)  
Budapest, Hungary

Simons Institute, Berkeley, CA  
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## Lower bounds

So far we have seen positive results: basic algorithmic techniques for fixed-parameter tractability.

What kind of negative results we have?

- Can we show that a problem (e.g., **CLIQUE**) is **not** FPT?  
⇒ Today
- Can we show that a problem (e.g., **VERTEX COVER**) has **no** algorithm with running time, say,  $2^{o(k)} \cdot n^{O(1)}$ ?  
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This would require showing that  $P \neq NP$ : if  $P = NP$ , then, e.g.,  $k$ -**CLIQUE** is polynomial-time solvable, hence FPT.

Can we give some evidence for negative results?

## Goals of this talk

Two goals:

- 1 Explain the theory behind parameterized intractability.
- 2 Show examples of parameterized reductions.

## Parameterized complexity

To build a complexity theory for parameterized problems, we need two concepts:

- An appropriate notion of reduction.
- An appropriate hypothesis.

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Polynomial-time reductions are not good for our purposes.

**Example:** Graph  $G$  has an independent set  $k$  if and only if it has a vertex cover of size  $n - k$ .

⇒ Transforming an **INDEPENDENT SET** instance  $(G, k)$  into a **VERTEX COVER** instance  $(G, n - k)$  is a correct polynomial-time reduction.

However, **VERTEX COVER** is FPT, but **INDEPENDENT SET** is not known to be FPT.

# Parameterized reduction

## Definition

**Parameterized reduction** from problem  $P$  to problem  $Q$ : a function  $\phi$  with the following properties:

- $\phi(x)$  is a yes-instance of  $Q \iff x$  is a yes-instance of  $P$ .
- $\phi(x)$  can be computed in time  $f(k) \cdot |x|^{O(1)}$ , where  $k$  is the parameter of  $x$ ,
- If  $k$  is the parameter of  $x$  and  $k'$  is the parameter of  $\phi(x)$ , then  $k' \leq g(k)$  for some function  $g$ .

**Fact:** If there is a parameterized reduction from problem  $P$  to problem  $Q$  and  $Q$  is FPT, then  $P$  is also FPT.

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**Fact:** If there is a parameterized reduction from problem  $P$  to problem  $Q$  and  $Q$  is FPT, then  $P$  is also FPT.

**Non-example:** Transforming an **INDEPENDENT SET** instance  $(G, k)$  into a **VERTEX COVER** instance  $(G, n - k)$  is **not** a parameterized reduction.

**Example:** Transforming an **INDEPENDENT SET** instance  $(G, k)$  into a **CLIQUE** instance  $(\overline{G}, k)$  is a parameterized reduction.

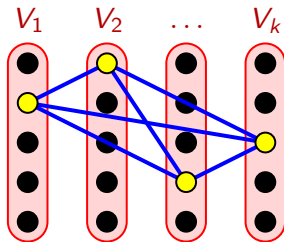


# MULTICOLORED CLIQUE

A useful variant of **CLIQUE**:

**MULTICOLORED CLIQUE**: The vertices of the input graph  $G$  are colored with  $k$  colors and we have to find a clique containing one vertex from each color.

(or **PARTITIONED CLIQUE**)



## Theorem

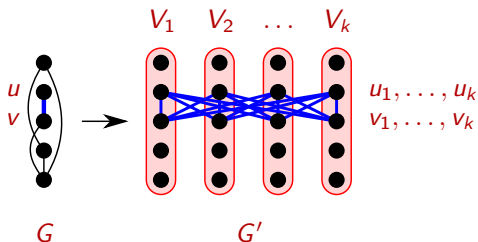
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# MULTICOLORED CLIQUE

## Theorem

There is a parameterized reduction from **CLIQUE** to **MULTICOLORED CLIQUE**.

Create  $G'$  by replacing each vertex  $v$  with  $k$  vertices, one in each color class. If  $u$  and  $v$  are adjacent in the original graph, connect all copies of  $u$  with all copies of  $v$ .



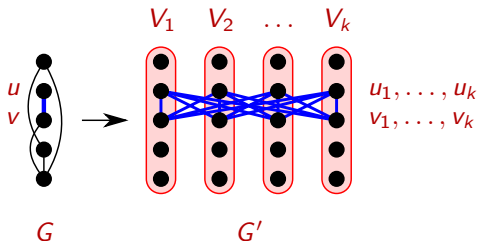
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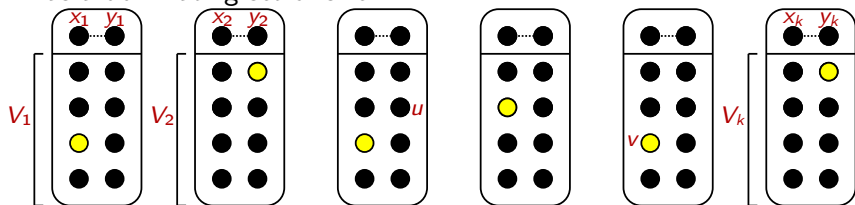
**Similarly:** reduction to **MULTICOLORED INDEPENDENT SET**.

# DOMINATING SET

## Theorem

There is a parameterized reduction from **MULTICOLORED INDEPENDENT SET** to **DOMINATING SET**.

**Proof:** Let  $G$  be a graph with color classes  $V_1, \dots, V_k$ . We construct a graph  $H$  such that  $G$  has a multicolored  $k$ -clique iff  $H$  has a dominating set of size  $k$ .



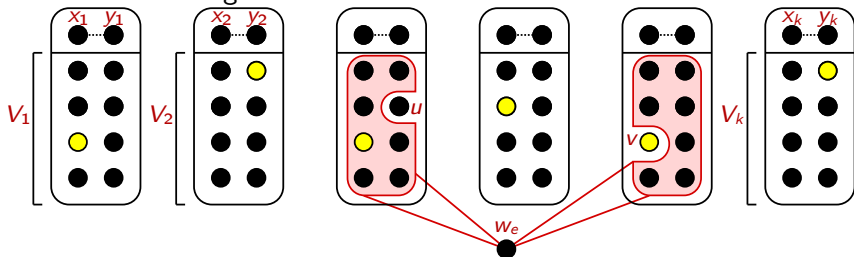
- The dominating set has to contain one vertex from each of the  $k$  cliques  $V_1, \dots, V_k$  to dominate every  $x_i$  and  $y_i$ .

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- The dominating set has to contain one vertex from each of the  $k$  cliques  $V_1, \dots, V_k$  to dominate every  $x_i$  and  $y_i$ .
- For every edge  $e = uv$ , an additional vertex  $w_e$  ensures that these selections describe an independent set.

## Variants of DOMINATING SET

- **DOMINATING SET**: Given a graph, find  $k$  vertices that dominate every vertex.
- **RED-BLUE DOMINATING SET**: Given a bipartite graph, find  $k$  vertices on the red side that dominate the blue side.
- **SET COVER**: Given a set system, find  $k$  sets whose union covers the universe.
- **HITTING SET**: Given a set system, find  $k$  elements that intersect every set in the system.

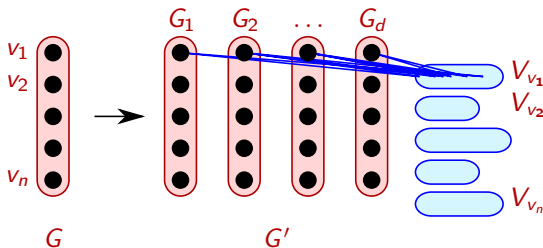
All of these problems are equivalent under parameterized reductions, hence at least as hard as **CLIQUE**.

# Regular graphs

## Theorem

There is a parameterized reduction from **CLIQUE** to **CLIQUE** on regular graphs.

**Proof:** Given a graph  $G$  and an integer  $k$ , let  $d$  be the maximum degree of  $G$ . Take  $d$  copies of  $G$  and for every  $v \in V(G)$ , fully connect every copy of  $v$  with a set  $V_v$  of  $d - d(v)$  vertices.



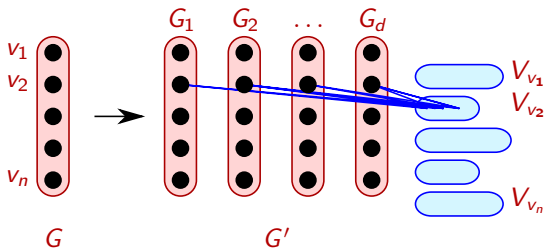
Observe the edges incident to  $V_v$  do not appear in any triangle, hence every  $k$ -clique of  $G'$  is a  $k$ -clique of  $G$  (assuming  $k \geq 3$ ).

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## PARTIAL VERTEX COVER

**PARTIAL VERTEX COVER:** Given a graph  $G$ , integers  $k$  and  $s$ , find  $k$  vertices that cover at least  $s$  edges.

### Theorem

There is a parameterized reduction from **INDEPENDENT SET** on regular graphs parameterized by  $k$  to **PARTIAL VERTEX COVER** parameterized by  $k$ .

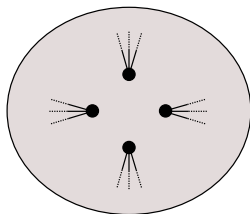
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**Proof:** If  $G$  is  $d$ -regular, then  $k$  vertices can cover  $s := kd$  edges if and only if there is an independent set of size  $k$ .



$$d = 3, k = 4, s = 12$$

# Hard problems

Hundreds of parameterized problems are known to be at least as hard as **CLIQUE**:

- **INDEPENDENT SET**
- **SET COVER**
- **HITTING SET**
- **CONNECTED DOMINATING SET**
- **INDEPENDENT DOMINATING SET**
- **PARTIAL VERTEX COVER** parameterized by  $k$
- **DOMINATING SET** in bipartite graphs
- ...

We believe that none of these problems are FPT.

## Basic hypotheses

It seems that parameterized complexity theory cannot be built on assuming  $P \neq NP$  – we have to assume something stronger.

Let us choose a basic hypothesis:

### Engineers' Hypothesis

$k$ -CLIQUE cannot be solved in time  $f(k) \cdot n^{O(1)}$ .

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$n$ -variable 3SAT cannot be solved in time  $2^{o(n)}$ .

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### Theorem

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**Proof:** Given a graph  $G$  and an integer  $k$ , we construct a Turing machine  $M$  and an integer  $k' = O(k^2)$  such that  $M$  halts in  $k'$  steps if and only if  $G$  has an independent set of size  $k$ .



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The alphabet  $\Sigma$  of  $M$  is the set of vertices of  $G$ .

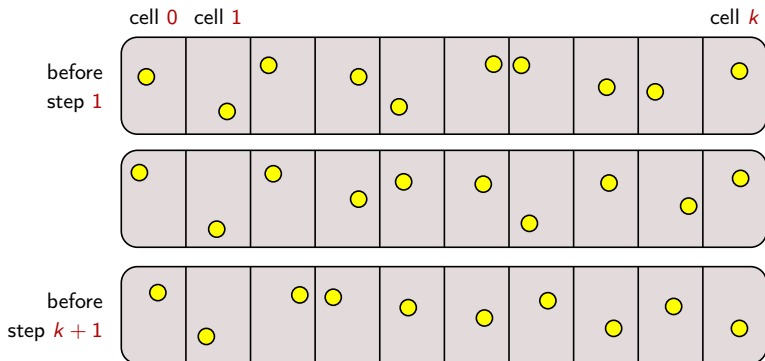
- In the first  $k$  steps,  $M$  nondeterministically writes  $k$  vertices to the first  $k$  cells.
- For every  $1 \leq i \leq k$ ,  $M$  moves to the  $i$ -th cell, stores the vertex in the internal state, and goes through the tape to check that every other vertex is nonadjacent with the  $i$ -th vertex (otherwise  $M$  loops).
- $M$  does  $k$  checks and each check can be done in  $2k$  steps  $\Rightarrow k' = O(k^2)$ .

# Turing machines $\Rightarrow$ INDEPENDENT SET

## Theorem

There is a parameterized reduction from the  $k$ -STEP HALTING PROBLEM to INDEPENDENT SET.

**Proof:** Given a Turing machine  $M$  and an integer  $k$ , we construct a graph  $G$  that has an independent set of size  $k' := (k + 1)^2$  if and only if  $M$  halts in  $k$  steps.



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- $G$  consists of  $(k + 1)^2$  cliques, thus a  $k'$ -independent set has to contain one vertex from each.
- The selected vertex from clique  $K_{i,j}$  describes the situation before step  $i$  at cell  $j$ : what is written there, is the head there, and if so, what the state is, and what the next transition is.
- We add edges between the cliques to rule out inconsistencies: head is at more than one location at the same time, wrong character is written, head moves in the wrong direction etc.

## Summary

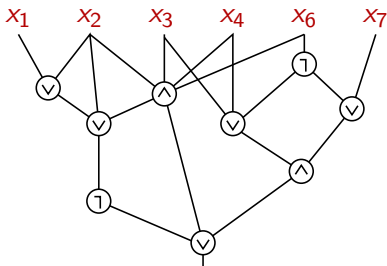
- INDEPENDENT SET and  $k$ -STEP HALTING PROBLEM can be reduced to each other  $\Rightarrow$  Engineers' Hypothesis and Theorists' Hypothesis are equivalent!
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- INDEPENDENT SET and  $k$ -STEP HALTING PROBLEM can be reduced to each other  $\Rightarrow$  Engineers' Hypothesis and Theorists' Hypothesis are equivalent!
- INDEPENDENT SET and  $k$ -STEP HALTING PROBLEM can be reduced to DOMINATING SET.
- Is there a parameterized reduction from DOMINATING SET to INDEPENDENT SET?
- Probably not. Unlike in NP-completeness, where most problems are equivalent, here we have a hierarchy of hard problems.
  - INDEPENDENT SET is  $W[1]$ -complete.
  - DOMINATING SET is  $W[2]$ -complete.
- Does not matter if we only care about whether a problem is FPT or not!

## Boolean circuit

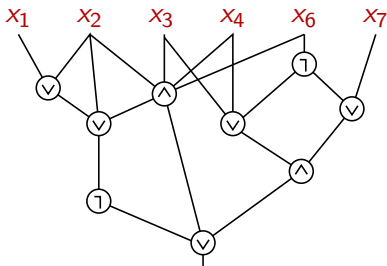
A **Boolean circuit** consists of input gates, negation gates, AND gates, OR gates, and a single output gate.



**CIRCUIT SATISFIABILITY:** Given a Boolean circuit  $C$ , decide if there is an assignment on the inputs of  $C$  making the output true.

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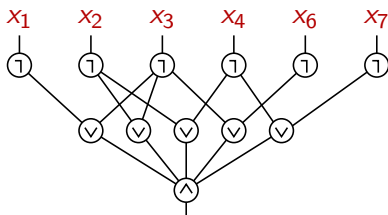
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**Weight of an assignment:** number of true values.

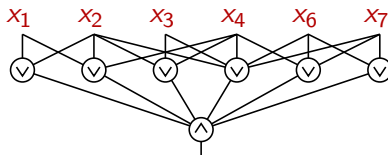
**WEIGHTED CIRCUIT SATISFIABILITY:** Given a Boolean circuit  $C$  and an integer  $k$ , decide if there is an assignment of weight  $k$  making the output true.

# WEIGHTED CIRCUIT SATISFIABILITY

INDEPENDENT SET can be reduced to WEIGHTED CIRCUIT SATISFIABILITY:



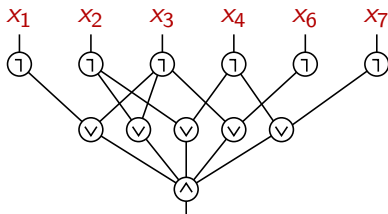
DOMINATING SET can be reduced to WEIGHTED CIRCUIT SATISFIABILITY:



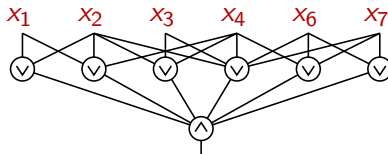


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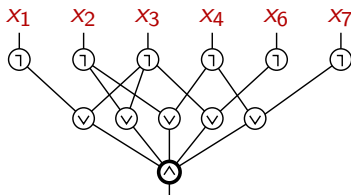
To express DOMINATING SET, we need more complicated circuits.

## Depth and weft

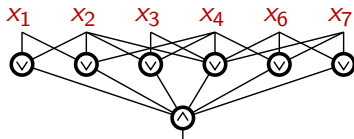
The **depth** of a circuit is the maximum length of a path from an input to the output.

A gate is **large** if it has more than 2 inputs. The **weft** of a circuit is the maximum number of large gates on a path from an input to the output.

**INDEPENDENT SET:** weft 1, depth 3



**DOMINATING SET:** weft 2, depth 2



# The W-hierarchy

Let  $C[t, d]$  be the set of all circuits having weft at most  $t$  and depth at most  $d$ .

## Definition

A problem  $P$  is in the class  $W[t]$  if there is a constant  $d$  and a parameterized reduction from  $P$  to **WEIGHTED CIRCUIT SATISFIABILITY** of  $C[t, d]$ .

We have seen that **INDEPENDENT SET** is in  $W[1]$  and **DOMINATING SET** is in  $W[2]$ .

**Fact:** **INDEPENDENT SET** is  $W[1]$ -complete.

**Fact:** **DOMINATING SET** is  $W[2]$ -complete.

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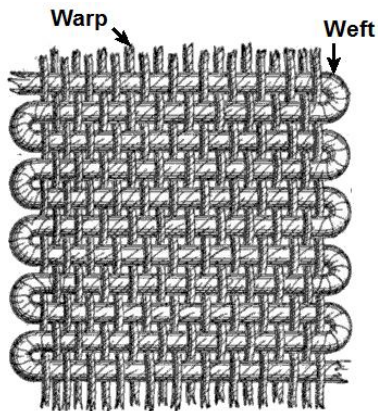
**Fact:** **DOMINATING SET** is  $W[2]$ -complete.

If any  $W[1]$ -complete problem is FPT, then  $FPT = W[1]$  and every problem in  $W[1]$  is FPT.

If any  $W[2]$ -complete problem is in  $W[1]$ , then  $W[1] = W[2]$ .

$\Rightarrow$  If there is a parameterized reduction from **DOMINATING SET** to **INDEPENDENT SET**, then  $W[1] = W[2]$ .

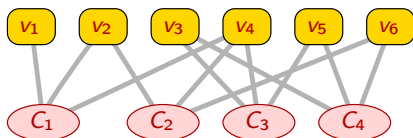
# Weft



**Weft** is a term related to weaving cloth: it is the thread that runs from side to side in the fabric.

## Parameterized reductions

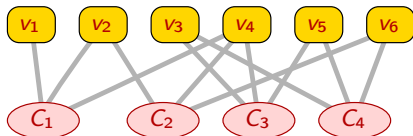
Typical NP-hardness proofs: reduction from e.g., CLIQUE or 3SAT, representing each vertex/edge/variable/clause with a gadget.



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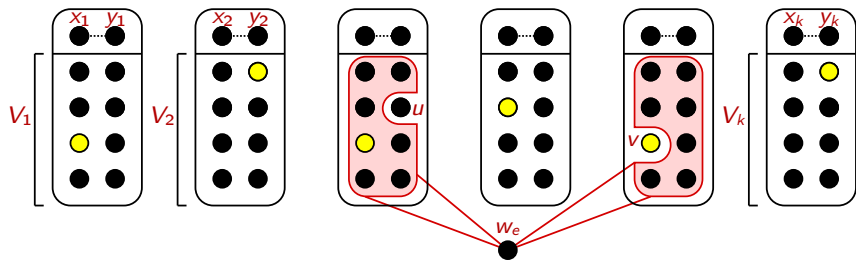
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Types of parameterized reductions:

- Reductions keeping the structure of the graph.
  - CLIQUE  $\Rightarrow$  INDEPENDENT SET
  - INDEPENDENT SET on regular graphs  $\Rightarrow$  PARTIAL VERTEX COVER
- Reductions with vertex representations.
  - MULTICOLORED INDEPENDENT SET  $\Rightarrow$  DOMINATING SET
- Reductions with vertex and edge representations.

## Vertex representation

**Recall:** Reduction from **MULTICOLORED INDEPENDENT SET** to **DOMINATING SET**:





# LIST COLORING

LIST COLORING is a generalization of ordinary vertex coloring:  
given a

- graph  $G$ ,
- a set of colors  $C$ , and
- a list  $L(v) \subseteq C$  for each vertex  $v$ ,

the task is to find a coloring  $c$  where  $c(v) \in L(v)$  for every  $v$ .

## Theorem

VERTEX COLORING is FPT parameterized by treewidth.

However, list coloring is more difficult:

## Theorem

LIST COLORING is  $W[1]$ -hard parameterized by treewidth.

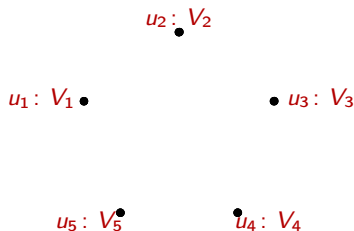
# LIST COLORING

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**Proof:** By reduction from MULTICOLORED INDEPENDENT SET.

- Let  $G$  be a graph with color classes  $V_1, \dots, V_k$ .
- Set  $C$  of colors: the set of vertices of  $G$ .
- The colors appearing on vertices  $u_1, \dots, u_k$  correspond to the  $k$  vertices of the clique, hence we set  $L(u_i) = V_i$ .



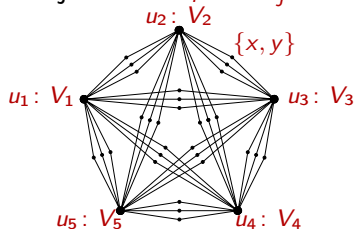
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LIST COLORING is  $W[1]$ -hard parameterized by treewidth.

**Proof:** By reduction from MULTICOLORED INDEPENDENT SET.

- Let  $G$  be a graph with color classes  $V_1, \dots, V_k$ .
- Set  $C$  of colors: the set of vertices of  $G$ .
- The colors appearing on vertices  $u_1, \dots, u_k$  correspond to the  $k$  vertices of the clique, hence we set  $L(u_i) = V_i$ .
- If  $x \in V_i$  and  $y \in V_j$  are adjacent in  $G$ , then we need to ensure that  $c(u_i) = x$  and  $c(u_j) = y$  are not true at the same time  $\Rightarrow$  we add a vertex adjacent to  $u_i$  and  $u_j$  whose list is  $\{x, y\}$ .



## Vertex representation

### Key idea

- Represent the  $k$  vertices of the solution with  $k$  gadgets.
- Connect the gadgets in a way that ensures that the represented values are **compatible**.

But sometimes it is very difficult to create connections that force two gadgets to be compatible...

## ODD SET

**ODD SET:** Given a set system  $\mathcal{F}$  over a universe  $U$  and an integer  $k$ , find a set  $S$  of at most  $k$  elements such that  $|S \cap F|$  is odd for every  $F \in \mathcal{F}$ .

### Theorem

ODD SET is  $W[1]$ -hard parameterized by  $k$ .

# ODD SET

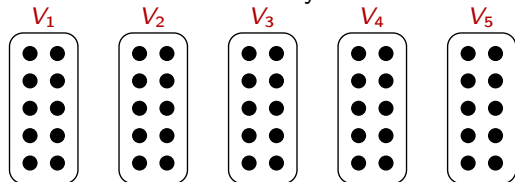
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**First try:** Reduction from MULTICOLORED INDEPENDENT SET.

Let  $U = V_1 \cup \dots \cup V_k$  and introduce each set  $V_i$  into  $\mathcal{F}$ .

$\Rightarrow$  The solution has to contain exactly one element from each  $V_i$ .



If  $xy \in E(G)$ , how can we express that  $x \in V_i$  and  $y \in V_j$  cannot be selected simultaneously?

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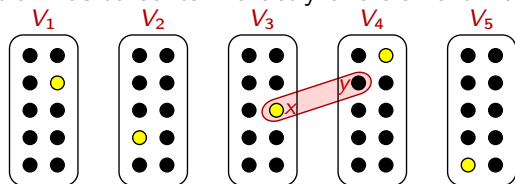
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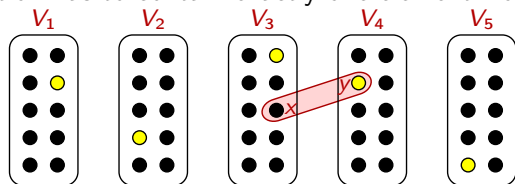
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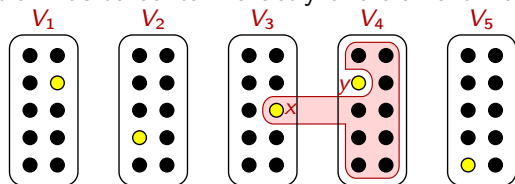
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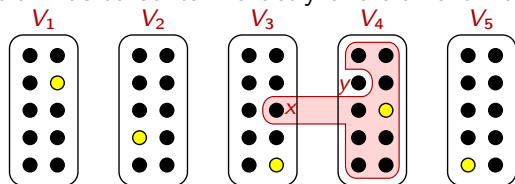
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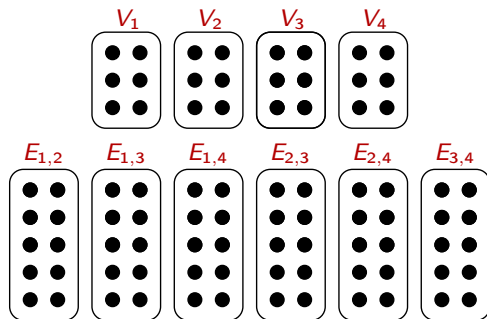
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Reduction from **MULTICOLORED CLIQUE**.

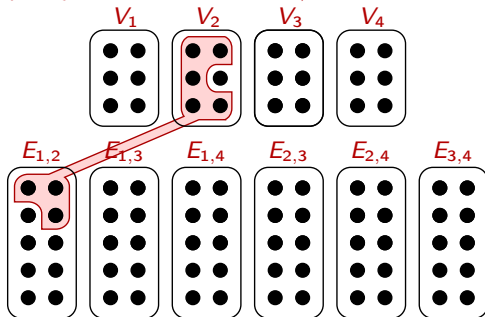
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- $k' := k + \binom{k}{2}$ .
- Let  $\mathcal{F}$  contain  $V_i$  ( $1 \leq i \leq k$ ) and  $E_{i,j}$  ( $1 \leq i < j \leq k$ ).



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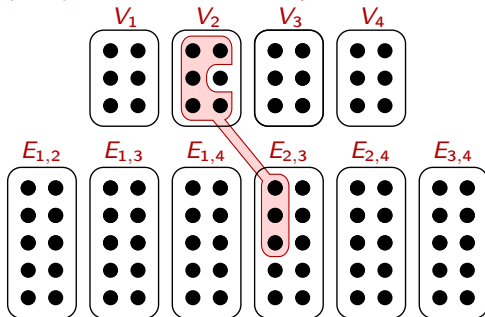
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- For every  $v \in V_i$  and  $x \neq i$ , we introduce the sets:  
( $V_i \setminus \{v\}$ )  $\cup$  {every edge from  $E_{i,x}$  with endpoint  $v$ }  
( $V_i \setminus \{v\}$ )  $\cup$  {every edge from  $E_{x,i}$  with endpoint  $v$ }



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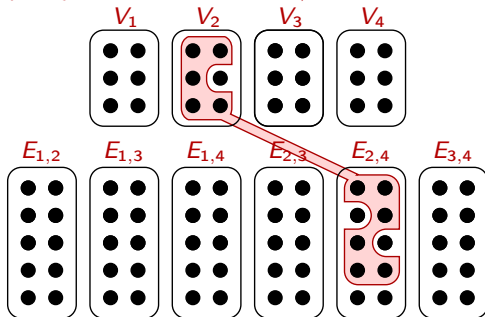
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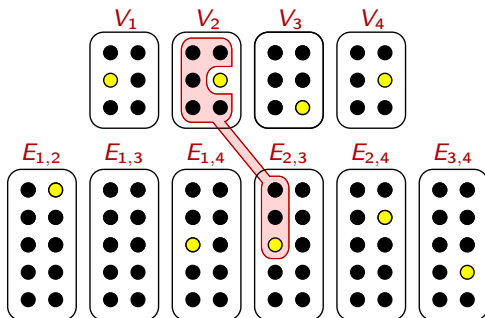
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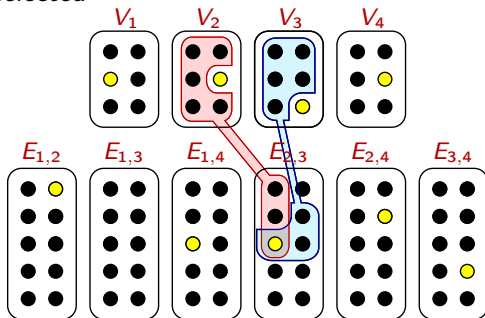
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- $v_i \in V_i$  selected  $\iff$  edge  $v_i v_j$  is selected in  $E_{i,x}$   
 $v_j \in V_j$  selected





## Vertex and edge representation

### Key idea

- Represent the vertices of the clique by  $k$  gadgets.
- Represent the edges of the clique by  $\binom{k}{2}$  gadgets.
- Connect edge gadget  $E_{i,j}$  to vertex gadgets  $V_i$  and  $V_j$  such that if  $E_{i,j}$  represents the edge between  $x \in V_i$  and  $y \in V_j$ , then it **forces**  $V_i$  to  $x$  and  $V_j$  to  $y$ .

The connection between the edge gadget and a vertex gadget needs to express a simple projection relation: a selection of an edge forces a selection of a vertex.

Typically blows up the parameter to  $O(k^2)$ !

## Variants of ODD SET

The following problems are  $W[1]$ -hard:

- ODD SET
- EXACT ODD SET (find a set of size exactly  $k$  ...)
- EXACT EVEN SET
- UNIQUE HITTING SET  
(at most  $k$  elements that hit each set exactly once)
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Open question:

**?** **EVEN SET:** Given a set system  $\mathcal{F}$  and an integer  $k$ , find a nonempty set  $S$  of at most  $k$  elements such  $|F \cap S|$  is even for every  $F \in \mathcal{F}$ .

## Summary

- By parameterized reductions, we can show that lots of parameterized problems are at least as hard as **CLIQUE**, hence unlikely to be fixed-parameter tractable.
- Connection with Turing machines gives some supporting evidence for hardness (only of theoretical interest).
- The **W**-hierarchy classifies the problems according to hardness (only of theoretical interest).
- Important trick in **W[1]**-hardness proofs: vertex and edge representations.