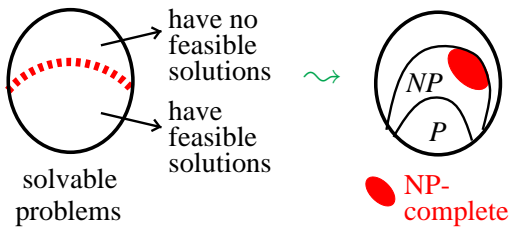




### NP-completeness (review)



$$L \in \mathcal{NPC} \Leftrightarrow L \in \mathcal{NP} \text{ and } L \in \mathcal{NP-hard}$$

### Today: Proving NP-completeness

- $L \in \mathcal{NP}$ : show that there is a “short”<sup>†</sup> **certificate** of membership in  $L$  (“id card”).
  - $L \in \mathcal{NP-hard}$ : show that there is an “efficient”<sup>†</sup> **reduction** from a known NP-hard problem  $L_{np}$  to  $L$ .
- <sup>†</sup> polynomial (length, time ...)



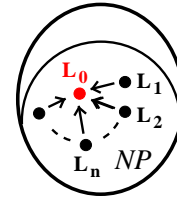
### Skills to learn

- Transforming problems into each other.

### Insight to gain

- Seeing unity in the midst of diversity: A variety of graph-theoretical, numerical, set & other problems are just variants of one another.

But before we can use reductions we need **the first NP-hard problem**.



### SATISFIABILITY (SAT)

#### Example

$$I = C \cup U$$

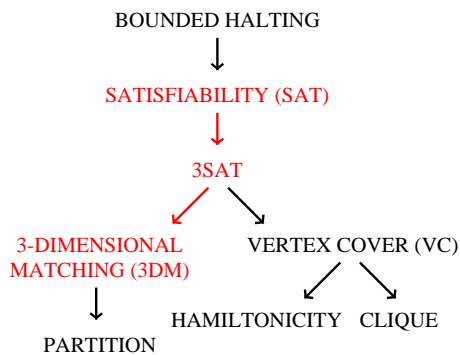
$$C = \{(x_1 \vee \neg x_2), (\neg x_1 \vee \neg x_2), (x_1 \vee x_2)\}$$

$$U = \{x_1, x_2\}$$

$T = x_1 \mapsto \text{TRUE}, x_2 \mapsto \text{FALSE}$  is a satisfying truth assignment. Hence the given instance  $I$  is **satisfiable**, i.e.  $I \in \text{SAT}$ .



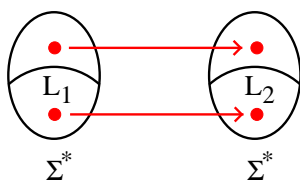
### Further (basic) reductions



### Polynomial-time reductions (review)

$L_1 \propto L_2$  means that

- $R: \Sigma^* \rightarrow \Sigma^*$  such that  $x \in L_1 \Rightarrow f_R(x) \in L_2$  and  $x \notin L_1 \Rightarrow f_R(x) \notin L_2$



- $R \in P_f$ , i.e.  $R(x)$  is polynomial computable



### SATISFIABILITY $\propto$ 3-SATISFIABILITY

**SAT** Clauses with any number of literals  $\mapsto$  **3SAT** Clauses with exactly 3 literals

- $C_j$  is the  $j$ 'th SAT-clause, and  $C'_j$  is the corresponding 3SAT-clauses.
- $y_j$  are new, fresh variables, only used in  $C'_j$ .

$$C_j \quad C'_j$$

$$(x_1 \vee x_2 \vee x_3) \mapsto (x_1 \vee x_2 \vee x_3)$$

$$(x_1 \vee x_2) \mapsto (x_1 \vee x_2 \vee y_j), (x_1 \vee x_2 \vee \neg y_j)$$

$$(x_1) \mapsto (x_1 \vee y_j^1 \vee y_j^2), (x_1 \vee \neg y_j^1 \vee y_j^2), (x_1 \vee y_j^1 \vee \neg y_j^2), (x_1 \vee \neg y_j^1 \vee \neg y_j^2)$$

$$(x_1 \vee \dots \vee x_8) \mapsto (x_1 \vee x_2 \vee y_j^1), (\neg y_j^1 \vee x_3 \vee y_j^2), (\neg y_j^2 \vee x_4 \vee y_j^3), (\neg y_j^3 \vee x_5 \vee y_j^4), (\neg y_j^4 \vee x_6 \vee y_j^5), (\neg y_j^5 \vee x_7 \vee x_8)$$

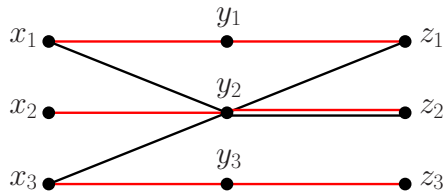
**Question:** Why is this a proper reduction?

**3-DIMENSIONAL MATCHING (3DM)**

**Instance:** A set  $M$  of triples  $(a, b, c)$  such that  $a \in A, b \in B, c \in C$ . All 3 sets have the same size  $q$  ( $|A| = |B| = |C| = q$ ).

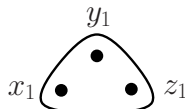
**Question:** Is there a **matching in  $M$** , i.e. a subset  $M' \subseteq M$  such that every element of  $A, B$  and  $C$  is part of exactly 1 triple in  $M'$ ?

**Example**



$$M = \{(x_1, y_1, z_1), (x_1, y_2, z_2), (x_2, y_2, z_2), (x_3, y_3, z_3), (x_3, y_2, z_1)\}$$

We will use sets with 3 elements to visualize triples:



Reductions are like translations from one language to another. The same properties must be expressed.

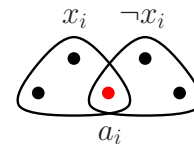
**3SAT  $\propto$  3DM**

3SAT	$\longleftrightarrow$	3DM
<b>variables</b> $x_1, \dots, x_n$		<b>variables</b> $x_3^j, a_3^j, b_j^2, c_k^1$
<b>literals</b> $x_1, \neg x_1$		<b>variables</b> $x_1^j, \neg x_1^j$
<b>clauses</b>		<b>triples</b> $(x_1^j, b_j^1, b_j^2)$
$C_j = (x_1 \vee \neg x_2 \vee \neg x_3)$		$(\neg x_3^j, b_j^1, b_j^2)$
"There exists a sat. truth assignment"		"There is a matching"

**"There is a truth assignment  $T$ "**

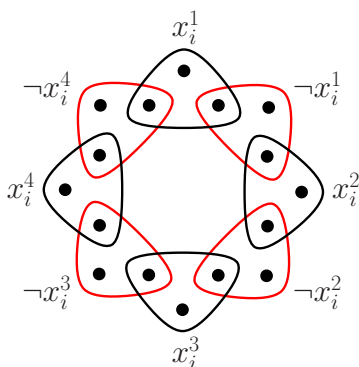
- $\exists T : \{x_1, \dots, x_n\} \rightarrow \{\text{TRUE}, \text{FALSE}\}$
- $T(x_i) = \text{TRUE} \Leftrightarrow T(\neg x_i) = \text{FALSE}$

The second property is easily translated to the 3DM-world:



$$T(X_i) = \text{TRUE} \longleftrightarrow x_i \text{ is not "married"}$$

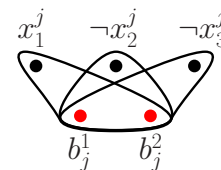
A literal  $x_i$  can be used in many clauses. In 3DM we must have as many copies of  $x_i$  as there are clauses:



- Either all the black triples must be chosen ("married") or all the red ones!
- If  $T(x_i) = \text{TRUE}$  then we choose all the red triples, and the black copies of  $x_i$  are free to be used later in the reduction. And vice versa.
- We make one such **truth setting component** for each variable  $x_i$  in 3SAT.

**" $T$  is satisfying"**

We translate each clause (example:  $C_j = (x_1 \vee \neg x_2 \vee \neg x_3)$ ) into 3 triples:

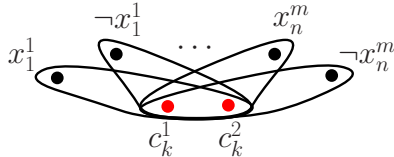


- $b_j^1$  and  $b_j^2$  can be married if and only if at least one of the literals in  $C_j$  is not married in the truth setting component.
- If we have a satisfiable 3SAT-instance, then all  $b_j^1$  and  $b_j^2$ -variables ( $1 \leq j \leq m$ ) can be married.
- If we have a negative 3SAT-instance, then some  $b_j^1$  and  $b_j^2$ -variables will not be married.



**Cleaning up (“Garbage collection”)**

There are many  $x_i^j$  who are neither married in the truth setting components nor in the “clause-satisfying” part. We introduce a number of fresh  $c$ -variables who can marry “everybody”:



- There are  $m \times n$  unmarried  $x$ -variables after the truth setting part.
- If all  $m$  clauses are satisfiable then there will remain  $(m \times n) - m = m(n - 1)$  unmarried  $x$ -variables.
- So we let  $1 \leq k \leq m(n - 1)$ .



**PARTITION**

**Instance:** A finite set  $A$  and sizes  $s(a) \in \mathbb{Z}^+$  for each  $a \in A$ .

**Question:** Can we **partition** the set into two sets that have equal size, i.e. is there a subset  $A' \subseteq A$  such that

$$\sum_{a \in A'} s(a) = \sum_{a \in A \setminus A'} s(a)$$

**3DM  $\propto$  PARTITION**

We first reduce 3DM to SUBSET SUM where we are given  $A$ , as in PARTITION, but also a number  $B$ , and where we are asked if it is possible to choose a subset of  $A$  with sizes that add up to  $B$ .

3DM		SUBSET SUM
sets and		
triples (subsets)	$\mapsto$	numbers
“There is a matching $M'$ ”	$\mapsto$	“There is a subset with total size $B$ ”



**Difficulty:** We need to translate from subsets with 3 elements (triples) to numbers.



**Solution:** Use the **characteristic function** of a set!

**Example**

Given set  $U = \{x_1, x_2, \dots, x_n\}$  and subset  $S = \{x_1, x_3, x_4\}$ . The characteristic function of  $S$  is a binary number with  $n$  digits and bit 1, 3 and 4 set to 1:  $\underbrace{101100 \dots 0}_n$ .

There is a matching  $M' \iff$  There is a subset  $M'$   
 $\sum_{M'} \text{sizes} = B$

It is natural to set  $B = \overbrace{111 \dots 11}^n$ , since each element in the universe is used in exactly one of the triples in the matching.

**Technicality:** Carry bits!

$01_b + 10_b = 11_b$ , but also  $01_b + 01_b + 01_b = 11_b$ .



**3DM-instance:**

$$M \subseteq W \times X \times Y$$

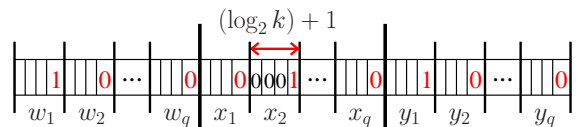
$$W = \{w_1, w_2, \dots, w_q\}$$

$$Y = \{y_1, y_2, \dots, y_q\}$$

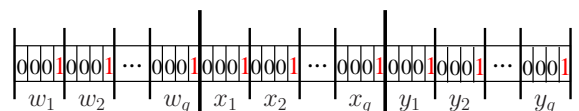
$$Z = \{z_1, z_2, \dots, z_q\}$$

$$M = \{m_1, m_2, \dots, m_k\}$$

- For each triple  $m_i \in M$  we construct a binary number:



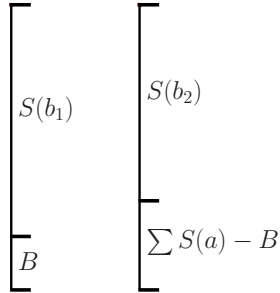
- This PARTITION/SUBSET SUM number corresponds to the triple  $(w_1, x_2, y_1)$ .
- By adding  $\log_2 k$  zeros between every “characteristic digit”, we eliminate potential summation problems due to overflow / carry bits.
- We make  $B$  as follows:





**SUBSET SUM  $\propto$  PARTITION**

- We introduce two new elements  $b_1$  and  $b_2$ .
- We choose  $s(b_1)$  and  $s(b_2)$  so big that every partition into two equal halves must have  $s(b_1)$  in one half and  $s(b_2)$  in the other.



- We let  $s(b_1) + B = s(b_2) + (\sum s(a) - B)$ .
- We can pick a subset of  $A$  which adds up to  $B$  if and only if we can split  $A \cup \{b_1, b_2\}$  into two equal halves.

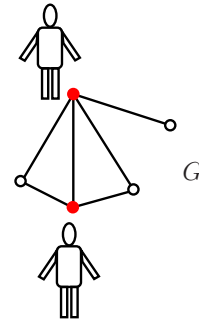


**VERTEX COVER (VC)**

**Instance:** A graph  $G$  with a set of vertices  $V$  and a set of edges  $E$ , and an integer  $K \leq |V|$ .

**Question:** Is there a **vertex cover** of  $G$  of size  $\leq K$ ?

“Can we place guards on at most  $K$  of the intersections (vertices) such that all the streets (edges) are surveyed?”



**3SAT  $\propto$  VC**

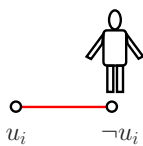
**3SAT**

literals  
clauses  
“There exists a sat. truth assignment”

**VERTEX COVER**

vertices  
subgraphs  
”There is a VC of size  $K$ ”

literals  $\mapsto$  vertices

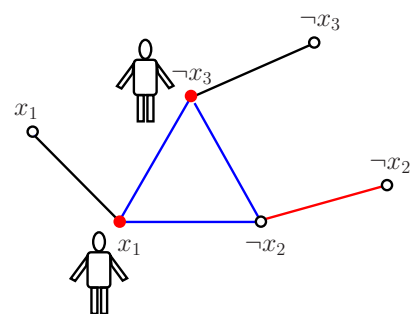


- A guard must be placed in either  $u_i$  or  $\neg u_i$  for the street between  $u_i$  and  $\neg u_i$  to be surveyed.
- If we only allow  $|V|$  guards to be used for all  $|V|$  streets of this kind, then we cannot place guards at both ends.
- Placing a guard on  $u_i$  corresponds to the 3SAT-literal  $u_i$  being TRUE.
- Placing a guard on  $\neg u_i$  corresponds to the 3SAT-literal  $\neg u_i$  being TRUE (and the  $u_i$ -variable being assigned to FALSE).



**clause  $\mapsto$  subgraph**

For clause  $C_j = (x_1 \vee \neg x_2 \vee \neg x_3)$  we make the following subgraph:



- We need guards on two of three nodes in the triangle to cover all three (blue) edges.
- If we are allowed to place only two guards per triangle, then we cannot cover all three outgoing edges.
- All 6 edges can be covered if and only if at least one edge (red) is covered from the outside vertex.
- By connecting the subgraph to the “truth-setting” components, this translates to one of the literals being TRUE (guarded)!

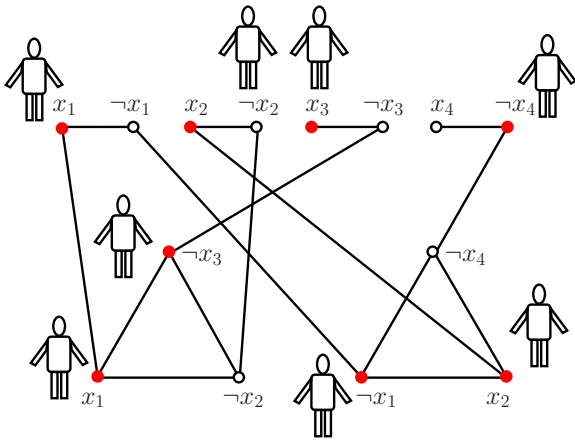


**Example**

**3SAT-instance:**

$$U = \{x_1, x_2, x_3, x_4\} \quad (n = 4)$$

$$C = \{\{x_1, \neg x_2, \neg x_3\}, \{\neg x_1, x_2, \neg x_4\}\} \quad (m = 2)$$



- Total number of guards  $K = n + 2m = 8$ .
- Should check that the reduction can be computed in time polynomial in the length of the 3SAT-instance ...



**VERTEX COVER, CLIQUE AND INDEPENDENT SET**

For  $G = (V, E)$  and subset  $V_1 \subset V$ , the following statements are equivalent:

- (a)  $V_1$  is a vertex cover of  $G$
- (b)  $V - V_1$  is an independent set in  $G$
- (c)  $V - V_1$  is a clique in  $G^c$ .

Corollary:

CLIQUE and INDEPENDENT SET are NP-complete.

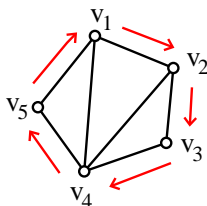


**HAMILTONICITY**

**Instance:** Graph  $G = (V, E)$ .

**Question:** Is there a **Hamiltonian cycle/path** in  $G$ ?

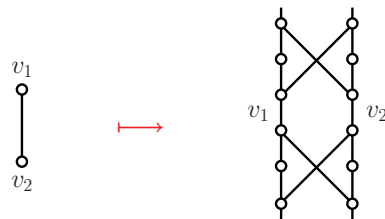
Is there a “tour” along the edges such that all vertices are visited exactly once? (a Hamiltonian cycle requires that we can go back from the last node to the first node)



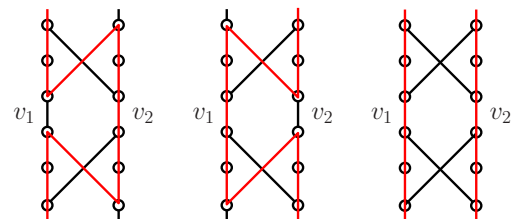
**VC  $\propto$  HAMILTONICITY**

VC		HAMILTONICITY
edges	$\mapsto$	edge gadgets
vertices	$\mapsto$	how gadgets are connected
$K$ guards	$\mapsto$	$K$ selector nodes

edges  $\mapsto$  edge gadgets



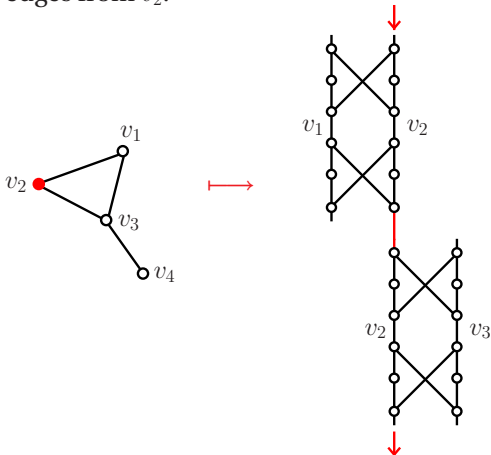
A Hamiltonian path can visit the vertices in the edge gadget in one of three ways:



We want this to correspond to guards being placed on  $v_1$  or  $v_2$  or both  $v_1$  and  $v_2$ , respectively.

vertices  $\mapsto$  how gadgets are connected

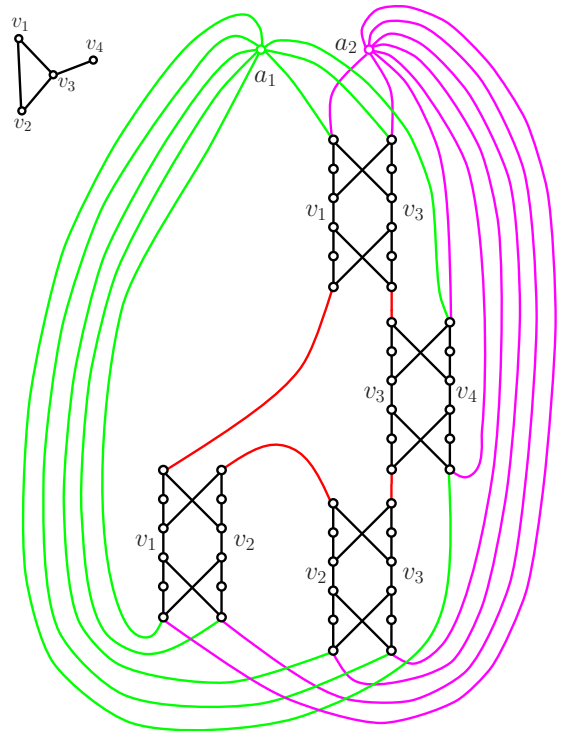
For each vertex  $v_2$ , we connect together **in serial** all edge gadgets corresponding to edges from  $v_2$ :



- Any Hamiltonian path entering at the  $v_2$ -side (red arrow) can visit (if necessary) all vertices in the serially-connected gadgets and will eventually exit at bottom on the  $v_2$ -side.
- This corresponds to the VC-property that a guard on  $v_2$  covers all outgoing edges from  $v_2$ .

$K$  guards  $\mapsto$   $K$  selector nodes

We finish the construction by introducing  $K$  selector nodes  $a_i$  which are connected with all "loose" edges:



There is a VC which uses  $K$  guards  $\Leftrightarrow$  There is a Hamiltonian cycle

