



## Algorithm Design XVII

### NP Problem III

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## The Reductions

## Reduction Between Search Problems

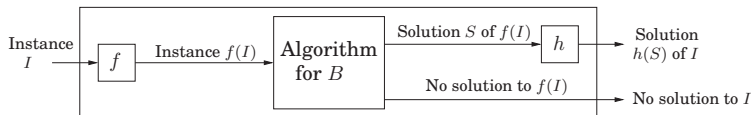


A **reduction** from  $A$  to  $B$  is a **polynomial** time algorithm  $f$  that transforms any instance  $I$  of  $A$  into an instance  $f(I)$  of  $B$

Together with another **polynomial** time algorithm  $h$  that maps any solution  $S$  of  $f(I)$  back into a solution  $h(S)$  of  $I$ .

If  $f(I)$  has **no solution**, then neither does  $I$ .

These two translation procedures  $f$  and  $h$  imply that any algorithm for  $B$  can be **converted** into an algorithm for  $A$ .



# The Two Ways to Use Reductions

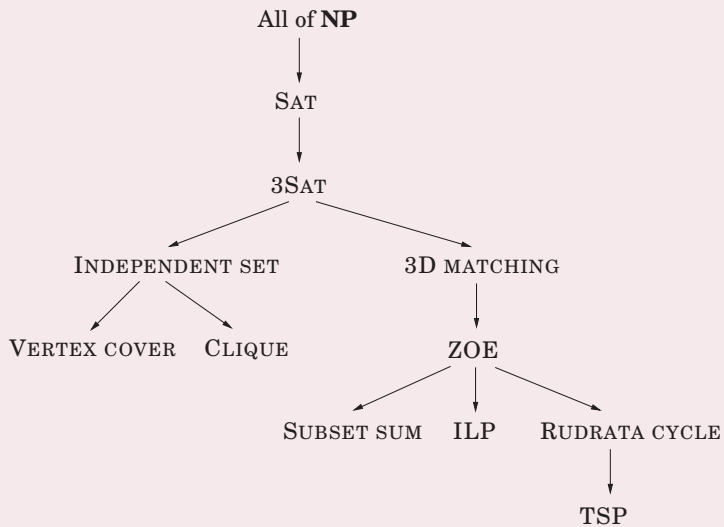


Assume there is a **reduction** from a problem  $A$  to a problem  $B$ .

$$A \rightarrow B$$

- If we can solve  $B$  **efficiently**, then we can also solve  $A$  **efficiently**.
- If we know  $A$  is **hard**, then  $B$  must be **hard** too.

If  $A \rightarrow B$  and  $B \rightarrow C$ , then  $A \rightarrow C$ .



RUDRATA PATH  $\rightarrow$  RUDRATA CYCLE

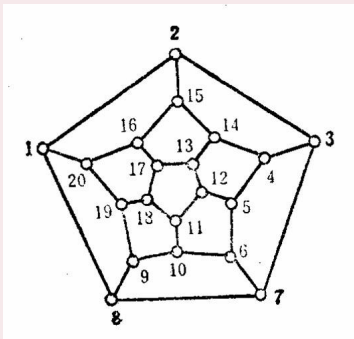
# Rudrata Cycle



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## RUDRATA CYCLE

Given a graph, find a cycle that visits each vertex exactly once.



## RUDRATA $(s, t)$ -PATH $\rightarrow$ RUDRATA CYCLE



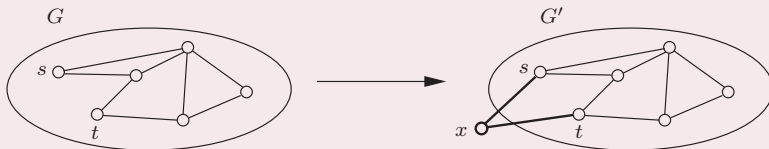
A RUDRATA  $(s, t)$ -PATH problem specifies two vertices  $s$  and  $t$  and wants a path starting at  $s$  and ending at  $t$  that goes through each vertex exactly once.

**Q:** Is it possible that RUDRATA CYCLE is easier than RUDRATA  $(s, t)$ -PATH?

The reduction maps an instance  $G$  of RUDRATA  $(s, t)$ -PATH into an instance  $G'$  of RUDRATA CYCLE as follows:  $G'$  is  $G$  with an additional vertex  $x$  and two new edges  $\{s, x\}$  and  $\{x, t\}$ .



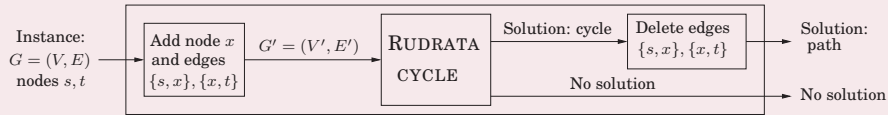
## RUDRATA $(s, t)$ -PATH $\rightarrow$ RUDRATA CYCLE



## RUDRATA $(s, t)$ -PATH $\rightarrow$ RUDRATA CYCLE



### RUDRATA $(s, t)$ -PATH



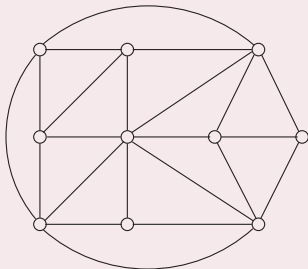
3SAT  $\rightarrow$  INDEPENDENT SET



The instances of **3SAT**, is set of clauses, each with three or fewer literals.

$$(x \vee y \vee z)(x \vee \bar{y})(y \vee \bar{z})(z \vee \bar{x})(\bar{x} \vee \bar{y} \vee \bar{z})$$

## Independent Set



**INDEPENDENT SET:** Given a graph  $G$  and an integer  $g$ , find  $g$  vertices, no two of which have an edge between them.

## True Assignment



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To form a satisfying truth assignment we must pick one literal from each clause and give it the value `true`.

The choices must be consistent, if we choose  $\bar{x}$  in one clause, we cannot choose  $x$  in another.

**Solution:** put an edge between any two vertices that correspond to opposite literals.



Represent a clause, say  $(x \vee \overline{y} \vee z)$ , by a triangle, with vertices labeled  $x, \overline{y}, z$ .

Because a triangle has its three vertices maximally connected, and thus forces to pick only one of them for the **independent set**.

## 3SAT $\rightarrow$ INDEPENDENT SET

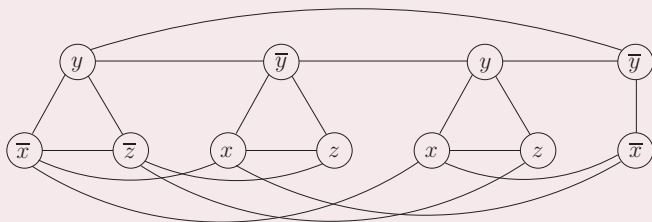


Given an instance  $I$  of 3SAT, create an instance  $(G, g)$  of INDEPENDENT SET as follows,

- A triangle for each clause, with vertices labeled by the clause's literals.
- Additional edges between any two vertices that represent opposite literals.
- The goal  $g$  is set to the number of clauses.



## 3SAT $\rightarrow$ INDEPENDENT SET



$$(\bar{x} \vee y \vee \bar{z})(x \vee \bar{y} \vee z)(x \vee y \vee z)(\bar{x} \vee \bar{y})$$

$\text{SAT} \rightarrow 3\text{SAT}$

## SAT $\rightarrow$ 3SAT



This is an interesting and common kind of reduction, from a problem to a special case of itself.

Given an instance  $I$  of SAT, use exactly the same instance for 3SAT, except that any clause with more than three literals,

$$(a_1 \vee a_2 \vee \dots \vee a_k)$$

is replaced by a set of clauses,

$$(a_1 \vee a_2 \vee y_1)(\overline{y_1} \vee a_3 \vee y_2)(\overline{y_2} \vee a_4 \vee y_3) \dots (\overline{y_{k-3}} \vee a_{k-1} \vee a_k)$$

where the  $y_i$ 's are new variables.

The reduction is in polynomial and  $I'$  is equivalent to  $I$  in terms of satisfiability.

$$\left\{ \begin{array}{c} (a_1 \vee a_2 \vee \dots \vee a_k) \\ \text{is satisfied} \end{array} \right\} \iff \left\{ \begin{array}{c} \text{there is a setting of the } y_i\text{'s for which} \\ (a_1 \vee a_2 \vee y_1) (\overline{y_1} \vee a_3 \vee y_2) \dots (\overline{y_{k-3}} \vee a_{k-1} \vee a_k) \\ \text{are all satisfied} \end{array} \right\}$$

Suppose that the clauses on the right are all satisfied. Then **at least** one of the literals  $a_1, \dots, a_k$  must be **true**. Otherwise  $y_1$  would have to be **true**, which would in turn force  $y_2$  to be **true**, and so on.

Conversely, if  $(a_1 \vee a_2 \vee \dots \vee a_k)$  is **satisfied**, then some  $a_i$  must be **true**. Set  $y_1, \dots, y_{i-2}$  to **true** and the rest to **false**.



3SAT remains hard even under the further restriction that no variable appears in more than three clauses.

Suppose that in the 3SAT instance, variable  $x$  appears in  $k > 3$  clauses. Then replace its first appearance by  $x_1$ , its second by  $x_2$ , and so on, replacing each of its  $k$  appearances by a different new variable.

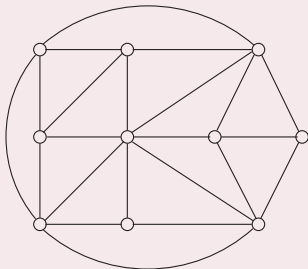
Finally, add the clauses

$$(\overline{x_1} \vee x_2)(\overline{x_2} \vee x_3) \dots (\overline{x_k} \vee x_1)$$

In the new formula no variable appears more than three times (and in fact, no literal appears more than twice).

INDEPENDENT SET  $\rightarrow$  VERTEX COVER

## Vertex Cover



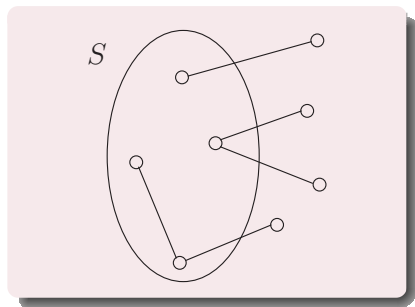
**VERTEX COVER:** Given a graph  $G$  and an integer  $b$ , find  $b$  vertices cover (touch) every edge.

## INDEPENDENT SET $\rightarrow$ VERTEX COVER



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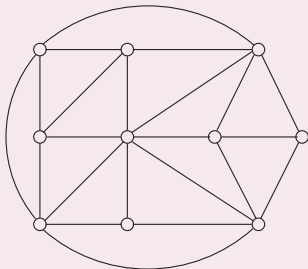
A set of nodes  $S$  is a vertex cover of graph  $G = (V, E)$  iff the remaining nodes,  $V - S$ , are an independent set of  $G$ .





INDEPENDENT SET  $\rightarrow$  CLIQUE

# Clique



**CLIQUE:** Given a graph  $G$  and an integer  $g$ , find  $g$  vertices such that all possible edges between them are present.

## INDEPENDENT SET $\rightarrow$ CLIQUE



The complement of a graph  $G = (V, E)$  is  $\overline{G} = (V, \overline{E})$ , where  $\overline{E}$  contains precisely those unordered pairs of vertices that are not in  $E$ . A set of nodes  $S$  is an independent set of  $G$  iff  $S$  is a **clique** of  $\overline{G}$ .

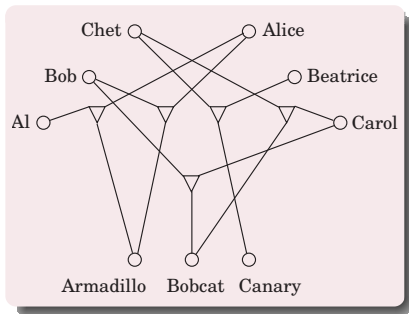
Therefore, we can reduce **INDEPENDENT SET** to **CLIQUE** by mapping an instance  $(G, g)$  of **INDEPENDENT SET** to the corresponding instance  $(\overline{G}, g)$  of **CLIQUE**.

3SAT  $\rightarrow$  3D MATCHING

## Three-Dimensional Matching



**3D MATCHING:** There are  $n$  boys,  $n$  girls, and  $n$  pets. The compatibilities are specified by a set of **triples**, each containing a boy, a girl, and a pet. A triple  $(b, g, p)$  means that boy  $b$ , girl  $g$ , and pet  $p$  get along well together. To find  $n$  disjoint triples and thereby create  $n$  harmonious households.

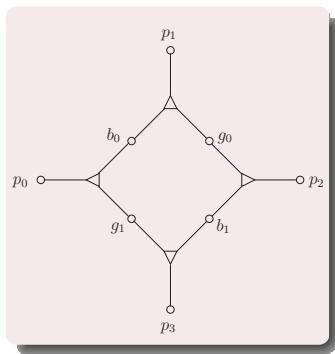


## 3SAT $\rightarrow$ 3D MATCHING



Consider a set of four triples, each represented by a triangular node joining a boy, girl, and pet.

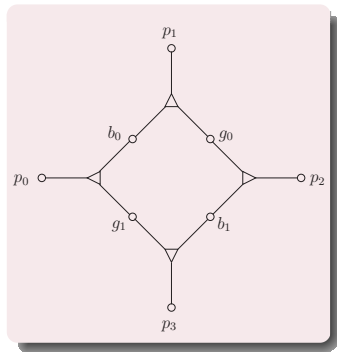
Any matching must contain either the two triples  $(b_0, g_1, p_0)$ ,  $(b_1, g_0, p_2)$  or  $(b_0, g_0, p_1)$ ,  $(b_1, g_1, p_3)$ .



## 3SAT $\rightarrow$ 3D MATCHING

Therefore, this “gadget” has two possible states: it behaves like a Boolean variable.

Transform an *instance* of **3SAT** to one of **3D MATCHING**, by creating a gadget for each variable  $x$ .



## 3SAT $\rightarrow$ 3D MATCHING



For each clause  $c$  introduce a new boy  $b_c$  and a new girl  $g_c$ .

E.g.,  $c = (x \vee \bar{y} \vee z)$ ,  $b_c, g_c$  will be involved in three triples, one for each literal in the clause.

And the pets in these triples must reflect the three ways whereby the clause can be satisfied:

- ①  $x = \text{true}$ ,
- ②  $y = \text{false}$ ,
- ③  $z = \text{true}$ .



## 3SAT $\rightarrow$ 3D MATCHING



For  $x = \text{true}$ , we have the triple  $(b_c, g_c, p_{x1})$ , where  $p_{x1}$  is the pet  $p_1$  in the gadget for  $x$ .

- If  $x = \text{true}$ , then  $b_{x0}$  is matched with  $g_{x1}$  and  $b_{x1}$  with  $g_{x0}$ , and so pets  $p_{x0}$  and  $p_{x2}$  are taken.
- If  $x = \text{false}$ , then  $p_{x1}$  and  $p_{x3}$  are taken, and so  $g_c$  and  $b_c$  cannot be accommodated.

We do the same thing for the other two literals, which yield triples involving  $b_c$  and  $g_c$  with either  $p_{y0}$  or  $p_{y2}$  and with either  $p_{z1}$  or  $p_{z3}$ .

## 3SAT $\rightarrow$ 3D MATCHING



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We have to make sure that for every occurrence of a literal in a clause  $c$  there is a different pet to match with  $b_c$  and  $g_c$ .

This is easy: an earlier reduction guarantees that no literal appears more than twice, and so each variable gadget has enough pets, two for negated occurrences and two for positive.

## 3SAT $\rightarrow$ 3D MATCHING



The last problem remains: in the matching defined so far, some pets may be left unmatched.

If there are  $n$  variables and  $m$  clauses, then  $2n - m$  pets will be left unmatched.

Add  $2n - m$  new boy-girl couples that are “generic animal-lovers”, and match them by triples with all the pets!

3D MATCHING  $\rightarrow$  ZOE

# Zero-One Equations



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## ZOE

Given an  $m \times n$  matrix  $A$  with  $0 - 1$  entries, and find a  $0 - 1$  vector  $\mathbf{x} = (x_1, \dots, x_n)$  such that the  $m$  equations  $A\mathbf{x} = \mathbf{1}$ ; are satisfied.



Assume in 3D MATCHING, there are  $m$  boys,  $m$  girls,  $m$  pets, and  $n$  boy-girl-pet triples.

We have  $0 - 1$  variables,  $x_1, \dots, x_n$ , one per triple, where  $x_i = 1$  means that the  $i$ -th triple is chosen for the matching, and  $x_i = 0$  means that it is not chosen.

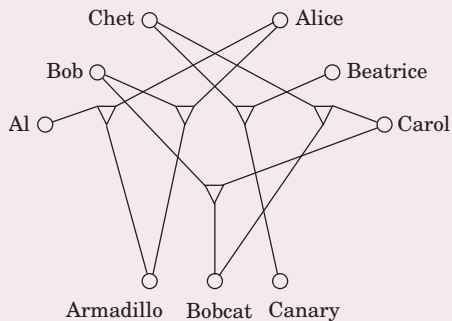
For each boy, girl, or pet, suppose that the triples containing him (or her, or it) are those numbered  $j_1, j_2, \dots, j_k$ ; the appropriate equation is then

$$x_{j_1} + x_{j_2} + \dots + x_{j_k} = 1$$

## 3D MATCHING $\rightarrow$ ZOE



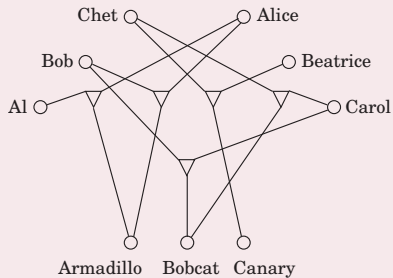
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## 3D MATCHING $\rightarrow$ ZOE



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$$\mathbf{A} = \begin{pmatrix} 1 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 1 & 1 \\ 0 & 1 & 1 & 0 & 0 \\ 1 & 0 & 0 & 0 & 1 \\ 0 & 1 & 0 & 0 & 0 \\ 0 & 0 & 1 & 1 & 0 \\ 1 & 0 & 0 & 0 & 1 \\ 0 & 0 & 1 & 1 & 0 \\ 0 & 1 & 0 & 0 & 0 \end{pmatrix}$$



ZOE  $\rightarrow$  SUBSET SUM

# Subset Sum



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## SUBSET SUM

**SUBSET SUM:** Find a subset of a given set of integers that adds up to exactly  $W$ .



This is a reduction between two special cases of **ILP**:

- One with many equations but only  $0 - 1$  coefficients;
- The other with a single equation but arbitrary integer coefficients.

The reduction is based on a simple and time-honored idea:  $0 - 1$  vectors can encode numbers!

If the columns is regarded as binary integers, a subset of the integers corresponds to the columns of  $A$  that add up to the binary integer  $11\dots 1$ .

This is an *instance* of **SUBSET SUM**. The reduction seems complete!

## An Example



$$\mathbf{A} = \begin{pmatrix} 1 & 0 & 0 & 0 \\ 0 & 0 & 0 & 1 \\ 0 & 1 & 1 & 0 \\ 1 & 0 & 0 & 0 \\ 0 & 1 & 0 & 0 \end{pmatrix}$$



Except for one detail: **carry**.

E.g., 5-bit binary integers can add up to  $11111 = 31$ , for example,  $5 + 6 + 20 = 31$  or, in binary,

$$00101 + 00110 + 10100 = 11111$$

even when the sum of the **corresponding vectors** is not  $(1, 1, 1, 1, 1)$ .

Solution: The column vectors not as integers in **base 2**, but as integers in **base  $n + 1$** , one more than the number of columns.

At most  $n$  integers are added, and all their digits are 0 and 1 There is no carry anymore.

ZOE  $\rightarrow$  ILP



3SAT is a special case of SAT, or, SAT is a generalization of 3SAT.

By special case we mean that the instances of 3SAT are a subset of the instances of SAT.

There is a reduction from 3SAT to SAT, where the input has no transformation, and the solution to the target instance also kept unchanged.

A useful and common way of establishing that a problem is NP-complete: it is a generalization of a known NP-complete problem.

E.g., the SET COVER problem is NP-complete because it is a generalization of VERTEX COVER.



In **ILP** we are looking for an integer vector  $\mathbf{x}$  that satisfies  $A\mathbf{x} \leq b$ , for given matrix  $A$  and vector  $b$ .

To write an *instance* of **ZOE** in this precise form, we need to rewrite each equation of the **ZOE instance** as two inequalities, and to add for each variable  $x_i$  the inequalities  $x_i \leq 1$  and  $-x_i \leq 0$ .



ZOE → RUDRATA CYCLE

## ZOE $\rightarrow$ RUDRATA CYCLE



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In **RUDRATA CYCLE**, seek a cycle in a graph that visits every vertex exactly once.

In **ZOE**, given an  $m \times n$  matrix  $A$  with  $0 - 1$  entries, and find a  $0 - 1$  vector  $\mathbf{x} = (x_1, \dots, x_n)$  such that the  $m$  equations  $A\mathbf{x} = \mathbf{1}$ ; are satisfied.



We will prove it NP-complete in two stages:

- 1 Firstly, reduce ZOE to a generalization of RUDRATA CYCLE, called RUDRATA CYCLE WITH PAIRED EDGES.
- 2 Secondly, get rid of the extra features of that problem and reduce it to the plain RUDRATA CYCLE.

## RUDRATA CYCLE WITH PAIRED EDGES



Given a graph  $G = (V, E)$  and a set  $C \subseteq E \times E$  of pairs of edges. Find a cycle that,

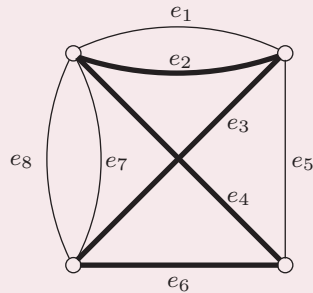
- 1 visits all vertices once,
- 2 for every pair of edges  $(e, e')$  in  $C$ , traverses either edge  $e$  or edge  $e'$  exactly one of them.

Notice that two or more parallel edges between two nodes are allowed.

## An Example



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$$C = \{(e_1, e_3), (e_5, e_6), (e_4, e_5), (e_3, e_7), (e_3, e_8)\}$$

## ZOE $\rightarrow$ RUDRATA CYCLE WITH PAIRED EDGES



Given an instance of ZOE,  $Ax = 1$ , where  $A$  is an  $m \times n$  matrix with 0 – 1 entries, the graph is as follows

- A cycle that connects  $m + n$  collections of parallel edges.
- Each variable  $x_i$  has two parallel edges, for  $x_i = 1$  and  $x_i = 0$ .
- Each equation  $x_{j_1} + \dots + x_{j_k} = 1$  involving  $k$  variables has  $k$  parallel edges, one for every variable appearing in the equation.

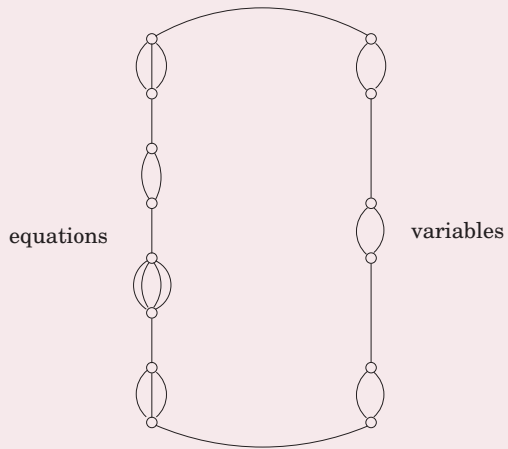
Any RUDRATA CYCLE traverses the  $m + n$  collections of parallel edges one by one, choosing one edge from each collection.

The cycle “chooses” for each variable a value 0 or 1 and, for each equation, a variable appearing in it.

## ZOE $\rightarrow$ RUDRATA CYCLE WITH PAIRED EDGES



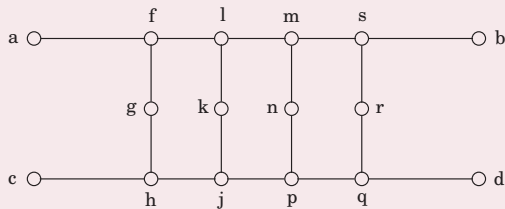
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## Get Rid of Edge Pairs

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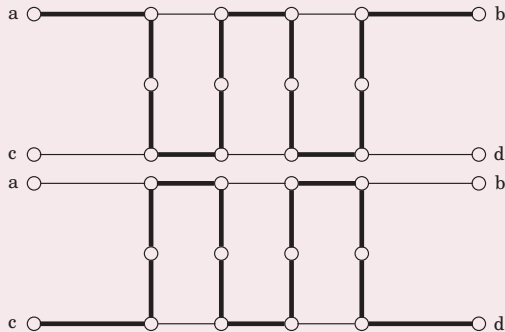
Consider the **graph**, and suppose it is a part of a larger graph  $G$  in such a way that only the four endpoints  $a, b, c, d$  touch the **rest** of the graph.





## Get Rid of Edge Pairs

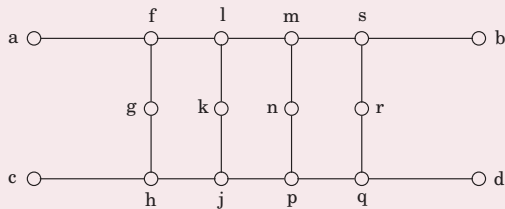
We claim that this graph has the following important property: in any **RUDRATA CYCLE** of  $G$  the subgraph shown must be traversed in one of the two ways.



## Get Rid of Edge Pairs



This gadget behaves just like two edges  $\{a, b\}$  and  $\{c, d\}$  that are paired up in the **RUDRATA CYCLE WITH PAIRED EDGES**.



$$C = \{(\{a, b\}, \{c, d\})\}$$

## RUDRATA CYCLE WITH PAIRED EDGES $\rightarrow$ RUDRATA CYCLE



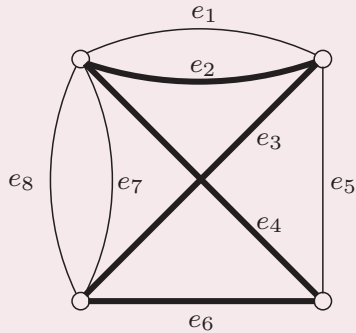
Go through the pairs in  $C$  one by one. To get rid of each pair  $(\{a, b\}, \{c, d\})$  by replacing the two edges with the gadget.

For any other pair in  $C$  that involves  $\{a, b\}$ , replace the edge  $\{a, b\}$  with the new edge  $\{a, f\}$ , where  $f$  is from the gadget.

Similarly,  $\{c, h\}$  replaces  $\{c, d\}$ .

The RUDRATA CYCLES in the resulting graph will be in one-to-one correspondence with the RUDRATA CYCLES in the original graph that conform to the constraints in  $C$ .

## An Example



$$C = \{(e_1, e_3), (e_5, e_6), (e_4, e_5), (e_3, e_7), (e_3, e_8)\}$$

RUDRATA CYCLE  $\rightarrow$  TSP

## RUDRATA CYCLE $\rightarrow$ TSP



Given a graph  $G = (V, E)$ , construct the *instance* of the TSP:

- The set of *nodes* is the same as  $V$ .
- The *distance* between cities  $u$  and  $v$  is 1 if  $\{u, v\}$  is an *edge* of  $G$  and  $1 + \alpha$  otherwise, for some  $\alpha > 1$  to be *determined*.
- The *budget* of the TSP *instance* is  $|V|$ .

If  $G$  has a *RUDRATA CYCLE*, then the same cycle is also a tour within the *budget* of the TSP *instance*.

If  $G$  has no *RUDRATA CYCLE*, then there is no solution: the cheapest possible TSP tour has cost at least  $n + \alpha$ .



If  $\alpha = 1$ , then all distances are either 1 or 2, and so this instance of the TSP satisfies the triangle inequality: if  $i, j, k$  are cities, then

$$d_{ij} + d_{jk} \geq d_{ik}$$

This is a special case of the TSP which is in a certain sense easier, since it can be efficiently approximated.



If  $\alpha$  is large, then the resulting instance of the TSP may not satisfy the triangle inequality, and has another important property.

This important gap property implies that, unless  $P = NP$ , no approximation algorithm is possible.



ANY PROBLEM  $\rightarrow$  SAT

home reading!

