• The reducibility relation " $\leq_T$ " is *transitive*, i.e,

 $A \leq_T B$  and  $B \leq_T C$  imply  $A \leq_T C$ 

- ► Therefore, to prove that a problem A is NPC, we need to (1) show that A ∈ NP
  - (2) choose some known NPC problem B, i.e., B ∈ NPC, define a polynomial transformation T from B to A show that B ≤<sub>T</sub> A

Why sufficient? the logic is as follows:

Since *B* is NPC, all problems in NP is reducible to *B*. Show *B* is reducible to *A*. Then all problems in NP is reducible to *A*. Therefore, *A* is NPC

Example 1.

The directed HC is known to be NPC. Use this fact to prove that Undirected HC is NPC.

Proof:

By direct verification, we know that undirected HC is in NP.
 Step A: Define a transformation T
 Step B: Show that

directed HC  $\leq_T$  undirected HC

▶ By (1) and (2), we conclude that the undirected HC is NPC.

## 4. How to prove a problem is NP-complete

Example 1, cont'd:

We now show that

### directed HC $\leq_T$ undirected HC

Step A

▶ Define transformation T:

Let G = (V, E) be a directed graph. Define G to the undirected graph G' = (V', E') by the following transformation T:

$$\begin{array}{c|c} \bullet & \underline{v \in V} & \longrightarrow & \underline{v^1, v^2, v^3 \in V'} \text{ and } (v^1, v^2), (v^2, v^3) \in E' \\ \hline \bullet & \underline{(u, v) \in E} & \longrightarrow & \underline{(u^3, v^1) \in E'} \end{array}$$

► T is polynomial-time computable.

# 4. How to prove a problem is NP-complete Example 1, cont'd:

An illustration of such transformation T:

Example 1, cont'd Step B: We show that G has a HC  $\iff$  G' has a HC. " $\Rightarrow$ " Suppose that G has a directed HC:  $v_1, v_2, \dots, v_n, v_1$  Then  $v_1^1, v_1^2, v_1^3, v_2^1, v_2^2, v_2^3, \dots, v_n^1, v_n^2, v_n^3, v_1^1$ 

is an undirected HC for G'.

Example 1, cont'd Step B: We show that

G has a HC  $\iff$  G' has a HC.

" $\Rightarrow$ " Suppose that G has a directed HC:  $v_1, v_2, \ldots, v_n, v_1$  Then

$$v_1^1, v_1^2, v_1^3, v_2^1, v_2^2, v_2^3, \dots, v_n^1, v_n^2, v_n^3, v_1^1$$

is an undirected HC for G'.

- " $\Leftarrow$ " 1. Suppose that G' has an undirected HC, the three vertices  $v^1, v^2, v^3$  that correspond to one vertex from G must be traversed **consecutively** in the order  $v^1, v^2, v^3$  or  $v^3, v^2, v^1$ , since  $v^2$  **cannot** be reached from any other vertex in G'.
  - Since the other edges in G' connect vertices with superscripts 1 or 3, if for any one triple the order of the superscripts is 1, 2, 3, then the order is 1, 2, 3 for all triples. Otherwise, it is 3, 2, 1 for all triples.
  - 3. Therefore, we may assume that the undirected HC of G' is

$$\underline{v_{i_1}^1, v_{i_1}^2, v_{i_1}^3, \underline{v_{i_2}^1, v_{i_2}^2, v_{i_2}^3, \dots, \underline{v_{i_n}^1, v_{i_n}^2, v_{i_n}^3, \underline{v_{i_1}^1}},$$

Then  $v_{i_1}, v_{i_2}, \ldots, v_{i_n}, v_{i_1}$  is a directed HC for G.

Example 2: Show that

Subset-Sum  $\leq_T$  Set-Partition

Since Subset-Sum is known to be NPC, the above reduction implies that Set-Partition is also NPC.

#### Subset-Sum decision problem:

Given a positive integer c, and a set  $S = \{s_1, s_2, \ldots, s_n\}$  of positive integers  $s_i$  for  $i = 1, 2, \ldots, n$ . Is there a  $J \subseteq \{1, 2, \ldots, n\}$  such that  $\sum_{i \in J} s_i = c$ ? assume that  $w = \sum_{i=1}^n s_i \ge c$ .

Set-Partition decision problem:

Given a set S of numbers. Can S be partitioned into two sets A and  $\bar{A} = S - A$  such that  $\sum_{x \in A} x = \sum_{x \in \bar{A}} x$ ?

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#### Example 2, cont'd

- Let S be an instance of Subset-Sum with  $w = \sum_{s_i \in S} s_i$  and the target c.
- Define the set S' (i.e., the transformation T from S to S') as follows:

$$S' = S \cup \{u, v\}, \quad \text{where} \quad u = 2w - c, \quad v = w + c.$$

Next to show that

Yes of Subset-Sum of  $S \Longleftrightarrow$  Yes of Set-Partition of S'

#### Example 2, cont'd

 $\implies \text{Let } J \subseteq S \text{ and the elements in } J \text{ sum to } c. \text{ Then } J \cup \{u\} \text{ sum to } 2w.$  Note that the elements in  $\overline{J} = S - J$  sum to w - c. Hence,  $\overline{J} \cup \{v\}$  also sums to 2w. Therefore, S' can be particulated into  $J \cup \{u\}$  and  $\overline{J} \cup \{v\}$  where both partitions sum to 2w. Thus, Yes of Subset-Sum *transforms* to a Yes of Set-Partition.

#### Example 2, cont'd

 $\quad \Longleftrightarrow \quad {\rm Assume} \ S' \ {\rm can} \ {\rm be} \ {\rm partitioned} \ {\rm into} \ {\rm two} \ {\rm sets}, \ T \ {\rm and} \ \overline{T} = S' - T, \ {\rm such} \ {\rm that}$  that

$$\sum_{x \in T} x = \sum_{x \in \overline{T}} x.$$
 (1)

Since w + u + v = 4w, the sum of the elements in both sets must be equal to 2w. Therefore, u must be in one set and v must be in the other because u + v = 3w. Without loss of generality, let  $u \in T$ . Then

$$2w = \sum_{x \in T} x = u + \sum_{x \in T-u} x = 2w - c + \sum_{x \in T-u} x.$$

It implies that

$$\sum_{x \in T-u} x = c$$

Thus, Yes of Set-Partition *transforms* to Yes of Subset-Sum. □

## 5. How to solve a NPC problem

Example 1: Bin Packing problem

Suppose we have an unlimited number of bins, each of capacity 1, and n objects with sizes  $s_1, s_2, \ldots, s_n$ , where  $0 < s_i \le 1$ .

- Optimization problem: Determine the smallest number of bins into which objects can be packed and find an optimal packing.
- Decision problem: Do the objects fit in k bins?

**Theorem.** Bin Packing problem is NPC Proof. reduced from the subset sum.

Approximate algorithm for the Bin Packing

- First-fit strategy (greedy): places an object in the first bin into which it fits.
- Example: Objects =  $\{0.8, 0.5, 0.4, 0.4, 0.3, 0.2, 0.2, 0.2\}$
- First-fit strategy solution:

$B_1$	$B_2$	$B_3$	$B_4$
		0.2	
0.2	0.4	0.3	
0.8	0.5	0.4	0.2

Optimal packing:

$B_1$	$B_2$	$B_3$
	0.2	0.2
0.2	0.3	0.4
0.8	0.5	0.4

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Theorem. Let 
$$S = \sum_{i=1}^{n} s_i$$

- 1. The optimal number of bins required is at least  $\lceil S \rceil$
- 2. The number of bins used by the first-fit strategy is never more than  $\lceil 2S \rceil.$

The vertex-cover problem:

- ▶ A vertex-cover of an undirected graph G = (V, E) is a subset set of  $V' \subseteq V$  such that if  $(u, v) \in E$ , then  $u \in V'$  (inclusive) or  $v \in V'$ .
- ▶ In other words, each vertex "covers" its incident edges, and a vertex cover for *G* is a set of vertices that covers all edges in *E*.
- The size of a vertex cover is the number of vertices in it.
- Decision problem: determine whether a graph has a vertex cover of a given size k
- Optimization problem: find a vertex cover of minimum size.
- **Theorem.** The vertex-cover problem is NPC.

The vertex-cover problem:

```
• An approximate algorithm

C = \emptyset

E' = E

while E' \neq \emptyset

let (u, v) be an arbitrary edge of E'

C = C \cup \{u, v\}

remove from E' every edge incident on either u or v.

endwhile

return C
```

• **Theorem.** The size of the vertex-cover is no more than twice the size of an optimal vertex cover.