

# CS3230 Tutorial 11

## Review

(AY 25/26 Semester 2)

April 6, 2026

(Prepared by Benson and Suhail)

# Contents

## Dynamic Programming

Q1(a). Max Independent Set of a Tree (DP)

## Greedy Algorithms

Q1(b). Max Independent Set of a Tree (Greedy)

## Amortized Analysis

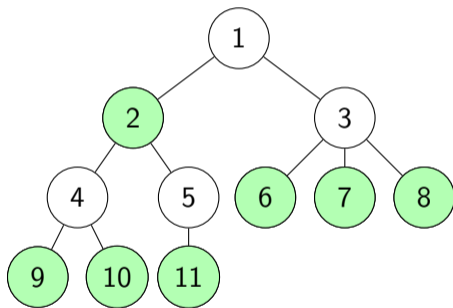
Q2. An efficient queue using two stacks

## Reductions

Q3. SUBSET-SUM  $\leq_p$  PARTITION

## Q1(a). Max Independent Set of a Tree (DP)

Given a tree with  $n$  vertices and  $n - 1$  edges. Devise an algorithm to find its maximum independent set in  $O(n)$  time.



**Recall:** A set of vertices  $I$  is called an **independent set** if no two vertices in  $I$  are adjacent to each other.

# Q1(a). Max Independent Set of a Tree (DP)

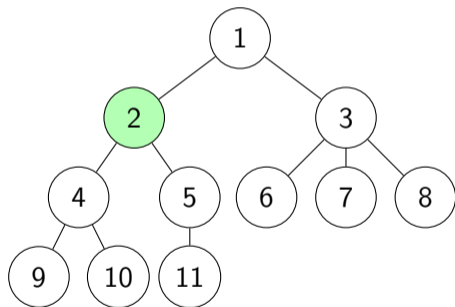
**Thought process for a dynamic programming solution:**

1. What are the decisions to be made? ( $\Rightarrow$  Optimal Substructure)
2. In what order do we make these decisions?
3. What information do we need to make a decision / calculate the answer? ( $\Rightarrow$  State)

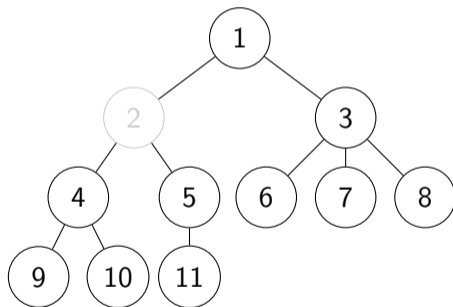
## Q1(a). Max Independent Set of a Tree (DP)

What is the decision to be made?

To include a vertex



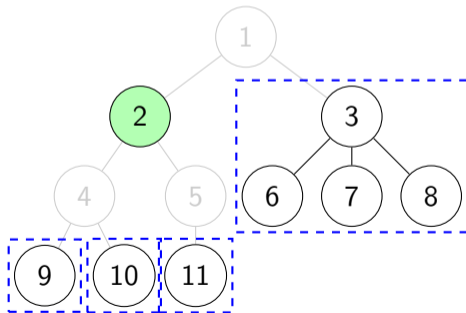
Not to include a vertex



## Q1(a). Max Independent Set of a Tree (DP)

### Optimal Substructure Property:

- ▶ Suppose we decided to pick a vertex  $v$  to be part of the independent set.
- ▶ What subproblem should we reduce to?
  - ▶ Remove  $v$  **and all its neighbours**. We end up with a forest of trees!
- ▶ Each tree in the forest (the subproblem) is optimally solved.

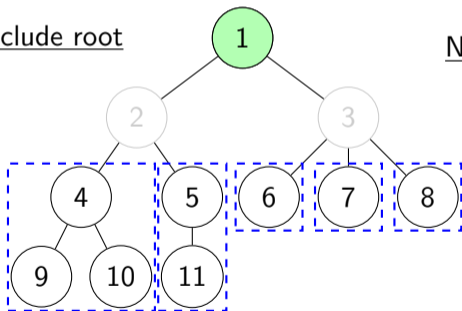


# Q1(a). Max Independent Set of a Tree (DP)

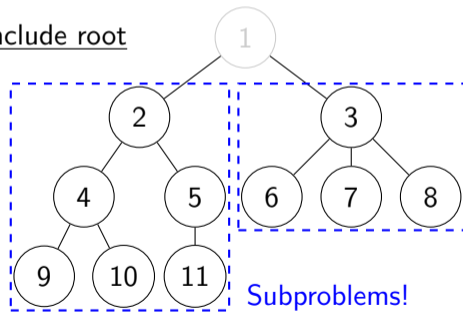
In what reasonable order do we make the decisions?

- ▶ From the root down to the leaves!

To include root



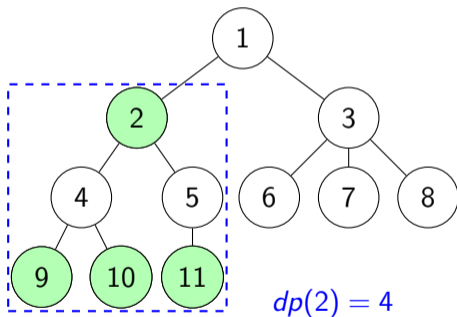
Not to include root



## Q1(a). Max Independent Set of a Tree (DP)

**State:** A snapshot of the problem at a particular point during the computation.

- ▶  $dp(i)$ : Size of the Maximum Independent Set for the subtree rooted at vertex  $i$ .



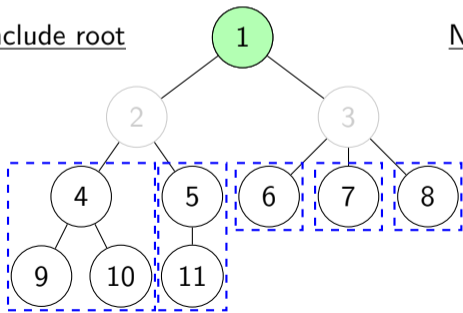
# Q1(a). Max Independent Set of a Tree (DP)

**Recurrence:** How you would calculate the value of a state from its subproblems.

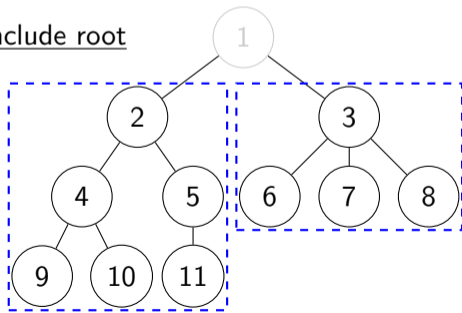
►  $dp(i)$ : Size of the Maximum Independent Set for the subtree rooted at vertex  $i$ .

$$\text{► } dp(i) = \max \left\{ 1 + \sum_{\text{grandchild } v \text{ of } i} dp(v), \sum_{\text{child } v \text{ of } i} dp(v) \right\}$$

To include root

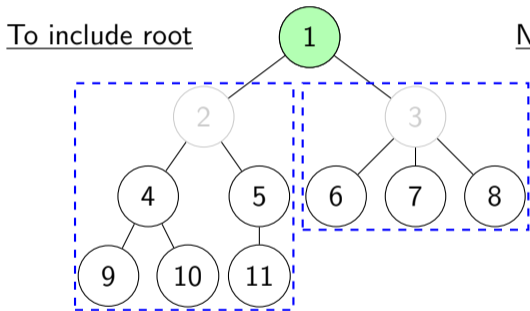


Not to include root

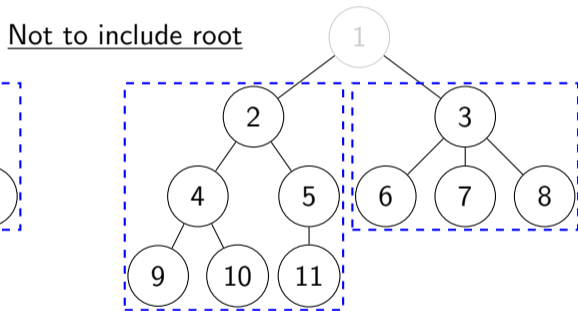


## Q1(a). Max Independent Set of a Tree (DP)

- ▶ This works but... can we avoid finding the grandchildren of the vertex  $i$ ?



For the subproblems, the root of the subtree cannot be chosen.

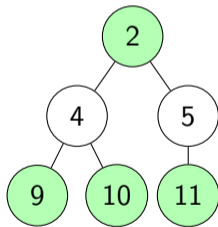


For the subproblems, the root of the subtree can be chosen.

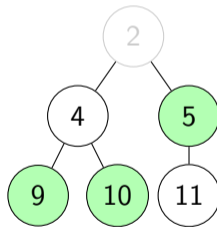
## Q1(a). Max Independent Set of a Tree (DP)

**State:** A snapshot of the problem at a particular point during the computation.

- ▶  $dp(i, hasRoot)$ : Size of the Maximum Independent Set for the subtree rooted at vertex  $i$ , where  $hasRoot$  is **true**  $\Leftrightarrow$  vertex  $i$  is included in the set.



$$dp(2, \mathbf{true}) = 4$$



$$dp(2, \mathbf{false}) = 3$$

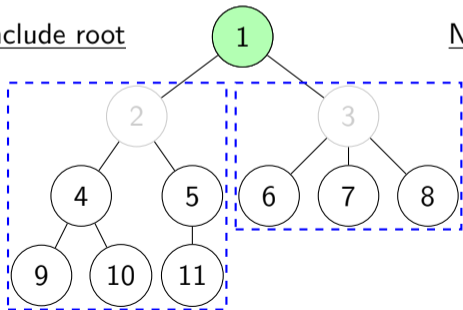
# Q1(a). Max Independent Set of a Tree (DP)

**Recurrence:** How you would calculate the value of a state from its subproblems.

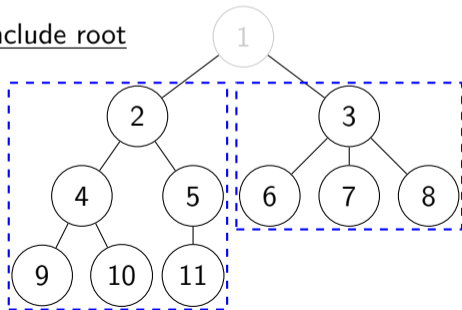
$$\blacktriangleright dp(i, \text{true}) = 1 + \sum_{\text{child } v \text{ of } i} dp(v, \text{false})$$

$$\blacktriangleright dp(i, \text{false}) = \sum_{\text{child } v \text{ of } i} \max\{dp(v, \text{true}), dp(v, \text{false})\}$$

To include root



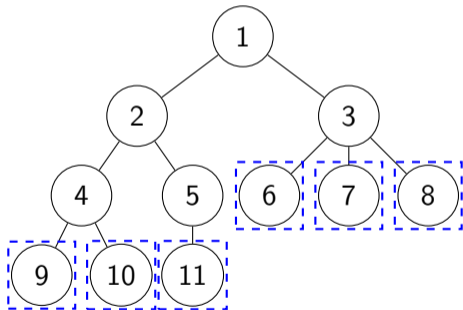
Not to include root



## Q1(a). Max Independent Set of a Tree (DP)

**Base case:** States whose values are **trivial to calculate**.

- ▶ If vertex  $i$  is a leaf:  $dp(i, \mathbf{true}) = 1, dp(i, \mathbf{false}) = 0$ .



## Q1(a). Max Independent Set of a Tree (DP)

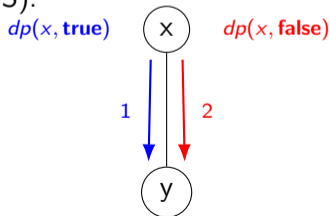
We can compute the answer in a **top-down** manner. Since  $dp(i, includeRoot)$  **only depends on its children** and the tree is **acyclic**, we will always reach base case (leaves).

The final answer will be  $\max\{dp(root, \mathbf{true}), dp(root, \mathbf{false})\}$ .

There are clearly  $2n$  states. Each state processes all children of vertex  $i$ . Across all states, each edge is considered **at most twice** (similar to DFS).

**Total Time Complexity:**  $O(n)$

**Space Complexity:**  $O(n)$  (for DP + recursion stack)

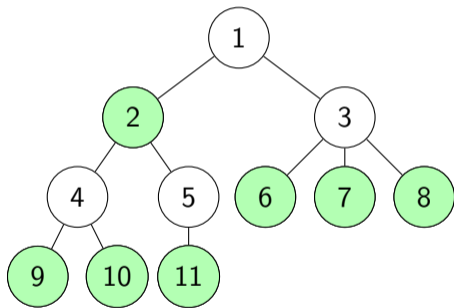


## Q1(b). Max Independent Set of a Tree (Greedy)

Is a greedy solution possible?

## Q1(b). Max Independent Set of a Tree (Greedy)

Given a tree with  $n$  vertices and  $n - 1$  edges. Devise an algorithm to find its maximum independent set in  $O(n)$  time.

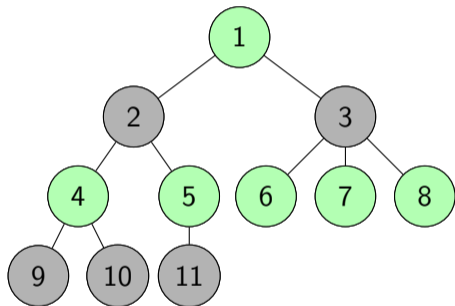


## Q1(b). Max Independent Set of a Tree (Greedy)

What kind of greedy choice can we make?

Always pick root?

- Doesn't work :(



## Q1(b). Max Independent Set of a Tree (Greedy)

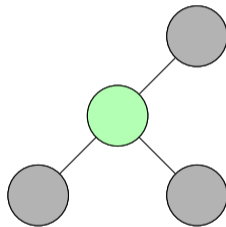
What kind of greedy choice can we make?

What happens when we choose a vertex?

- Blocks all neighbours!

Vertices with fewest neighbours?

- Leaves!



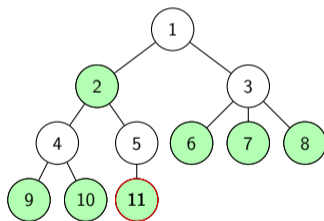
## Q1(b). Max Independent Set of a Tree (Greedy)

### Greedy Choice Property:

💡 Let  $v$  be a leaf in the tree. There exists a maximum independent set containing  $v$ .

Proof (by exchange argument):

- ▶ Consider any optimal solution  $OPT$ .



- ▶ If  $OPT$  already contains  $v$ , we are done.

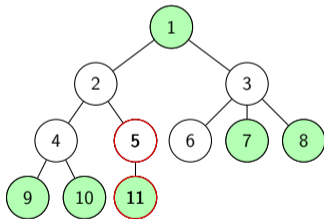
# Q1(b). Max Independent Set of a Tree (Greedy)

## Greedy Choice Property:

💡 Let  $v$  be a leaf in the tree. There exists a maximum independent set containing  $v$ .

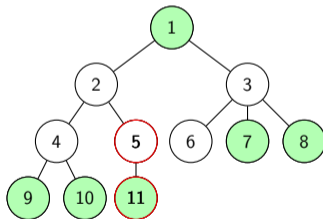
Proof (by exchange argument):

- ▶ If  $OPT$  doesn't contain  $v$ .
  - ▶ Case 1:  $v$ 's parent is **chosen**.



- ▶ Exchange  $v$ 's parent with  $v$  – Equally optimal solution!

- ▶ Case 2:  $v$ 's parent is **not chosen**.

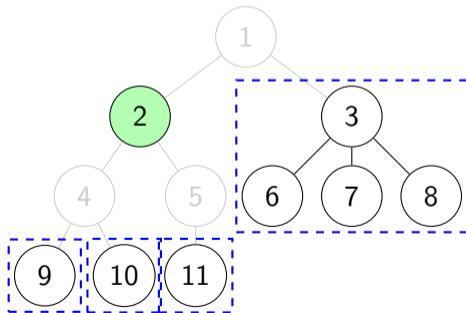


- ▶  $v$  can be chosen – Better solution! (Contradiction!)

## Q1(b). Max Independent Set of a Tree (Greedy)

### Optimal Substructure Property:

- ▶ Suppose we decided to pick a vertex  $v$  to be part of the independent set.
- ▶ What subproblem should we reduce to?
  - ▶ Remove  $v$  **and all its neighbours**. We end up with a forest of trees!
- ▶ Each tree in the forest (the subproblem) is optimally solved.

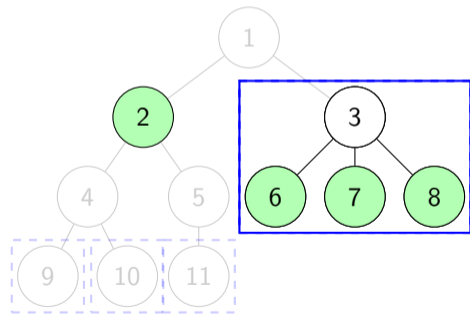


## Q1(b). Max Independent Set of a Tree (Greedy)

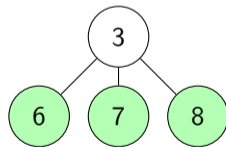
### Optimal Substructure Property:

💡 Let  $v \in OPT$ . Remove vertex  $v$  and all its neighbours.  $OPT$  contains a Maximum Independent Set in each tree in the resulting forest.

Proof Sketch (by cut-and-paste argument):



► Suppose not.



► Better solution! **Contradiction!**

## Q1(b). Max Independent Set of a Tree (Greedy)

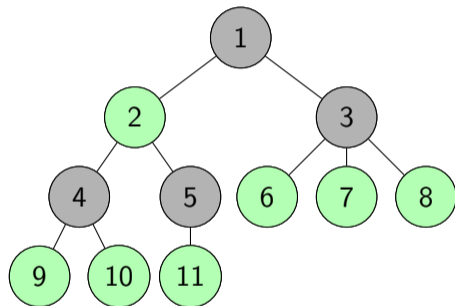
---

### Algorithm Greedy Algorithm

---

```
1: procedure FINDINDEPENDENTSET( $i$ )
2:    $I \leftarrow \emptyset$ 
3:   isRemoved  $\leftarrow$  false
4:   for each child  $v$  of  $i$  do
5:      $I \leftarrow I \cup$  FINDINDEPENDENTSET( $v$ )
6:     if  $v \in I$  then
7:       isRemoved  $\leftarrow$  true
8:   if not isRemoved then
9:      $I \leftarrow I \cup \{i\}$ 
10:  return  $I$ 
```

---



## Q1(b). Max Independent Set of a Tree (Greedy)

---

### Algorithm Greedy Algorithm

---

```
1: procedure FINDINDEPENDENTSET( $i$ )
2:    $I \leftarrow \emptyset$ 
3:   isRemoved  $\leftarrow$  false
4:   for each child  $v$  of  $i$  do
5:      $I \leftarrow I \cup \text{FINDINDEPENDENTSET}(v)$ 
6:     if  $v \in I$  then
7:        $\quad$  isRemoved  $\leftarrow$  true
8:   if not isRemoved then
9:      $I \leftarrow I \cup \{i\}$ 
10:  return  $I$ 
```

---

► **Time Complexity:**  $O(n)$

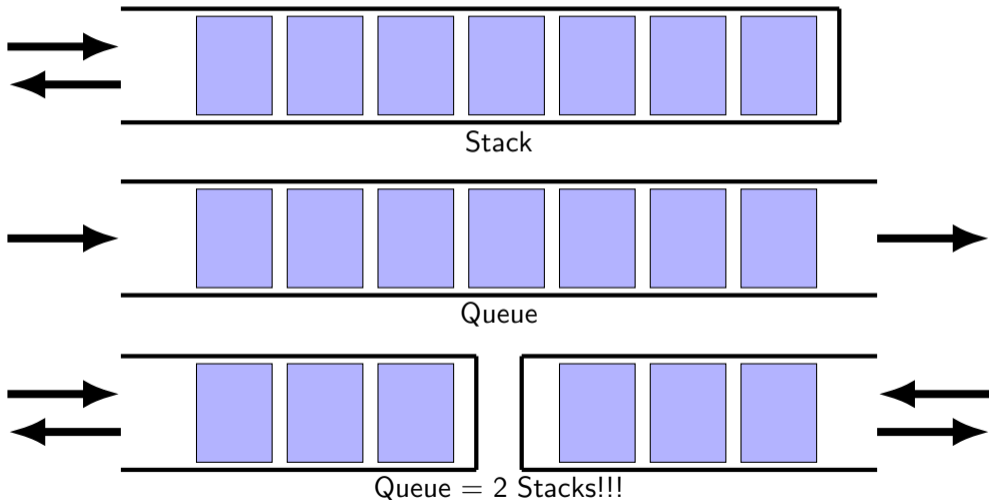
► **Space Complexity:**  $O(n)$

## Q2. An efficient queue using two stacks

Suppose you have Python lists that supports the operations `L.append(x)`, `L.pop()` and `len(L)` (amortized) in  $O(1)$ . Explain how you can use *two* lists to implement a FIFO queue efficiently, i.e. `PUSH(x)`, `PULL()`, `SIZE()` operations remains in (amortized)  $O(1)$ .

## Q2. An efficient queue using two stacks

**Idea:** (Thanks to Hua Jun for drawing the figures in CS3233 slides!)



## Q2. An efficient queue using two stacks

**i** This animation is not available in the review version. Please use the animated version of the slides.

## Q2. An efficient queue using two stacks

### Algorithm:

---

**Algorithm** An efficient queue using two stacks

---

```
1: Initialize two empty Python lists s1 and s2.
2: procedure PUSH( $x$ )
3:    $s1.append(x)$ 
4: procedure LEN()
5:   return  $len(s1) + len(s2)$ 
6: procedure POP()
7:   if  $len(s2) = 0$  then                                 $\triangleright s2$  is empty, transfer everything from  $s1$  to  $s2$ 
8:     while  $len(s1) > 0$  do
9:        $s2.append(s1.pop())$ 
10:  return  $s2.pop()$ 
```

---

## Q2. An efficient queue using two stacks

Let the lengths of  $s_1$  and  $s_2$  be  $\ell_1$  and  $\ell_2$  respectively.

Let the costs of append, pop and len be  $c_1$ ,  $c_2$  and  $c_3$  respectively.

Operation	Actual Cost	$\phi(i) - \phi(i - 1)$	Amortized Cost
PUSH	$c_1$		⊙ $O(1)$
LEN	$2c_3$		⊙ $O(1)$
POP ( $\text{len}(s_2) = 0$ )	$c_1 \times \ell_1$ $+ c_2 \times (\ell_1 + 1)$ $+ c_3 \times (\ell_1 + 2)$		⊙ $O(1)$
POP ( $\text{len}(s_2) \neq 0$ )	$c_2 + c_3$		⊙ $O(1)$

## Q2. An efficient queue using two stacks

**Main Idea:** Find something which **decreases a lot** after performing the expensive operation!

Potential function:  $\phi(i) = (c_1 + c_2 + c_3)l_1$ .



- ▶ Since  $l_1$  is empty at the beginning,  $\phi(0) = 0$ .
- ▶ Since  $c_1, c_2, c_3$  and  $l_1$  are all non-negative,  $\phi(i) \geq 0$ .

Operation	Actual Cost	$\phi(i) - \phi(i - 1)$	Amortized Cost
PUSH	$c_1$	$c_1 + c_2 + c_3$	$2c_1 + c_2 + c_3$
LEN	$2c_3$	0	$2c_3$
POP ( $\text{len}(s_2) = 0$ )	$c_1 \times l_1$ $+ c_2 \times (l_1 + 1)$ $+ c_3 \times (l_1 + 2)$	$-(c_1 + c_2 + c_3)l_1$	$c_2 + 2c_3$
POP ( $\text{len}(s_2) \neq 0$ )	$c_2 + c_3$	0	$c_2 + c_3$

### Q3. SUBSET-SUM $\leq_p$ PARTITION

Consider the following two problems.

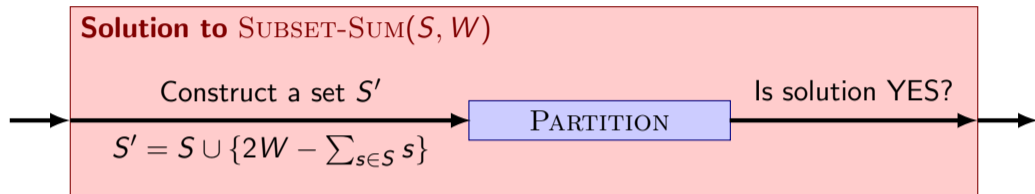
- ▶ **SUBSET-SUM**: Given a set of  $n$  non-negative integers  $S = \{w_1, \dots, w_n\}$  and a target  $W$ , decide whether there exists a subset  $I \subseteq \{1, 2, \dots, n\}$  such that  $\sum_{i \in I} w_i = W$ . (In other words, decide whether there exists a subset of  $S$  with sum  $W$ .)

YES-instance	NO-instance
$W = 0$ 	$W = 4$ 

- ▶ **PARTITION**: See Tutorial 11 slides.

Show that SUBSET-SUM  $\leq_p$  PARTITION.

### Q3. SUBSET-SUM $\leq_p$ PARTITION



Intuition:

- ▶ We want the PARTITION blackbox to give us a set that sums to  $W$ .  
⇒ The set  $S'$  should sum to  $2W$  so that each partition sums to  $W$ .
- ▶ How can we make that happen? By inserting an element into  $S$ !

### Q3. SUBSET-SUM $\leq_p$ PARTITION

**Theorem.**  $(S, W)$  is a YES-instance to SUBSET-SUM if and only if  $S'$  is a YES-instance to PARTITION.

Proof:

- ▶  $(\Rightarrow)$  Given that  $(S, W)$  is a YES-instance to SUBSET-SUM.
  - ▶ Then there exists  $T \subseteq S$  such that  $T$  sums to  $W$ .
  - ▶ Take  $T$  as one component of the partition and  $S' \setminus T$  as the other component. Then  $T$  sums to  $W$  and  $S' \setminus T$  sums to  $2W - W = W$ .
  - ▶ Hence  $S'$  is a YES-instance to PARTITION.



### Q3. SUBSET-SUM $\leq_p$ PARTITION

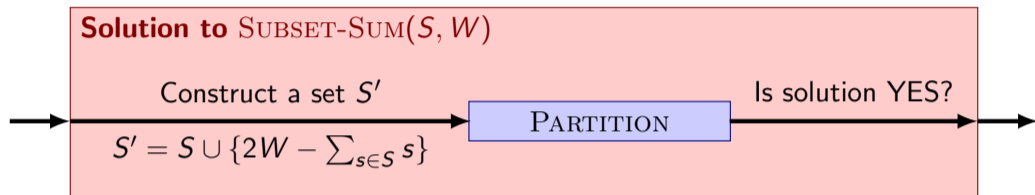
**Theorem.**  $(S, W)$  is a YES-instance to SUBSET-SUM if and only if  $S'$  is a YES-instance to PARTITION.

Proof:

- ▶ ( $\Leftarrow$ ) Given that  $S'$  is a YES-instance to PARTITION.
  - ▶ Then there exists a partition  $(P_1, P_2)$  of  $S'$ , both  $P_1$  and  $P_2$  sums to  $W$ .
  - ▶ One of  $P_1$  and  $P_2$  does not contain the new element  $2W - \sum_{s \in S} s$ . That is a subset of  $S$  that sums to  $W$ .
  - ▶ Hence  $(S, W)$  is a YES-instance to SUBSET-SUM.



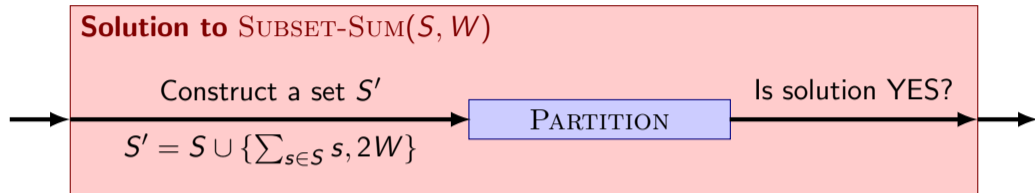
### Q3. SUBSET-SUM $\leq_p$ PARTITION



Any issues?

- ▶ PARTITION requires all the input elements to be **non-negative**.
- ▶ Our input instance does not ensure this constraint: When  $2W < \sum_{s \in S} s$ .

### Q3. SUBSET-SUM $\leq_p$ PARTITION



The correct solution: Add two elements instead!

- ▶ Insert the elements  $\sum_{s \in S} s$  and  $2W$ .
  - ▶ Total sum:  $2 \sum_{s \in S} s + 2W$ .
  - ▶ The partition gives us two (disjoint) sets of sum  $\sum_{s \in S} s + W$ .
  - ▶ **If  $W$  is positive**, these two new elements cannot be placed together.
- ▶ Proof is left as exercise!