

More NP-Complete and NP-hard Problems

Traveling Salesperson Path

Subset Sum

Partition

NP-completeness Proofs

1. The first part of an NP-completeness proof is showing the problem is in **NP**.
 2. The second part is giving a reduction **from** a known NP-complete problem.
- Sometimes, we can only show a problem ***NP-hard*** = “if the problem is in **P**, then **P = NP**,” but the problem may not be in **NP**.

Optimization Problems

- NP-complete problems are always **yes/no** questions.
- In practice, we tend to want to solve *optimization problems*, where our task is to minimize (or maximize) a function, $f(x)$, of the input, x .
- Optimization problems, strictly speaking, can't be NP-complete (only NP-hard).

Turning an Optimization Problem into a Decision Problem

- **Optimization Problem:** Given an input, x , find the smallest (or, largest) optimization value, $f(x)$, for x .
- **Corresponding Decision Problem:** Given an input, x , and integer k , is there an optimization value, $f(x)$, for x , that is at most (or, at least) k ?

Optimization Problems – (2)

- Optimization problems are never, strictly speaking, in **NP**.
 - They are not yes/no.
- But there is always a simple polynomial-time reduction from the yes/no version to the optimization version. (How?)

Example: TSP

- **Traveling Salesperson Problem:** Given an undirected complete graph, G , with integer weights on its edges, find the smallest-weight path from s to t in G that visits each other vertex in G .
- **Decision version:** Given G and an integer, K , is there a path from s to t of total weight at most K that visits each vertex in G ?

TSP is in NP

- Guess a path, P , from s to t .
- Check whether it visits each vertex in G .
- Sum up the weights of the edges in P and accept if the total weight is at most K .

Roadmap to show TSP is NP-hard

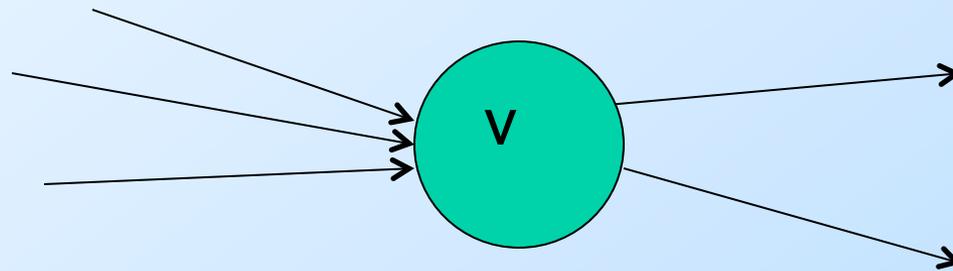
1. Provide a polytime reduction from Directed Hamiltonian Path (which we already know is NP-complete) to Undirected Hamiltonian Path
2. Provide a polytime reduction from Undirected Hamiltonian Path to TSP

From Directed Hamiltonian Path

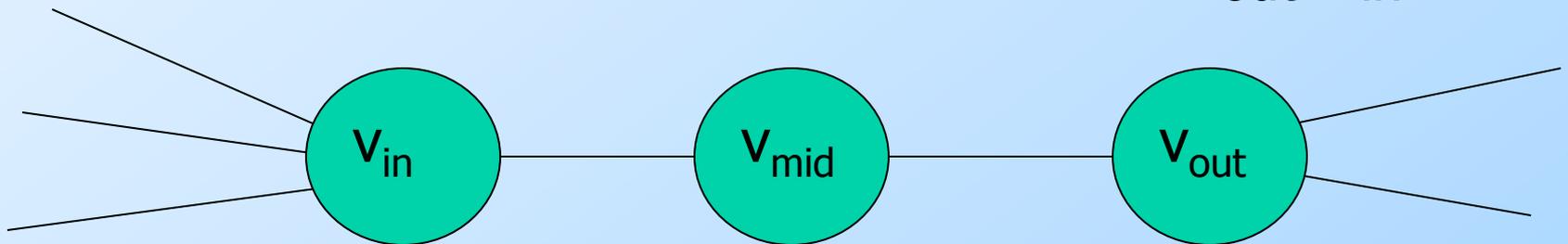
- DHP: Given a directed graph, G , and nodes s and t , is there a path from s to t in G that visits each other node exactly once?
- UHP: same question, but G is undirected.

DHP to UHP

- Replace each vertex, v , in the original graph, with three vertices, v_{in} , v_{mid} , v_{out} .



- Replace each edge (u, v) with (u_{out}, v_{in})



UHP to TSP

- Given an undirected graph, G , and nodes s and t .
- Create an undirected complete graph, H :
 - If edge (u,v) is in G , then give (u,v) weight 1 in H .
 - If edge (u,v) is not in G , then give (u,v) weight 2 in H .
- Set $K = n-1$, where n is the number of nodes. H has a TSP of weight K iff G has an undirected Hamiltonian Path.

A Number Problem: The Subset Sum Problem

- We shall prove NP-complete a problem just involving integers:
 - Given a set S of integers and a budget K , is there a subset of S whose sum is exactly K ?
- E.g., $S = \{5, 8, 9, 13, 17\}$, $K = 27$.
 - In this instance the answer is “Yes”:
 - $S' = \{5, 9, 13\}$

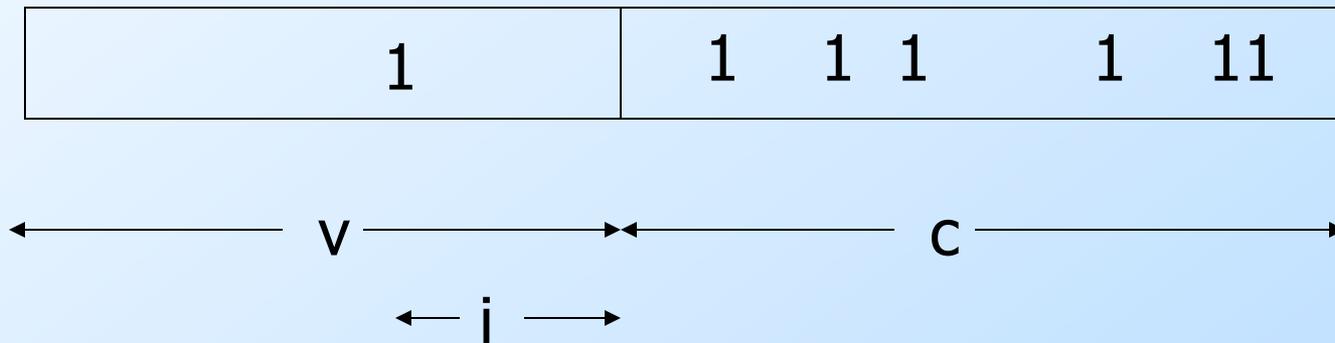
Subset Sum is in **NP**

- Guess a subset of the set S .
- Add 'em up.
- Accept if the sum is K .

Polytime Reduction of 3SAT to Subset Sum

- Given 3SAT instance, F , we must construct a set S of integers and a budget K .
- Suppose F has c clauses and v variables.
- S will have base-32 integers of length $c+v$, and there will be $3c+2v$ of them.

Picture of Integers for Literals



1 in i -th position
if this integer is
for x_i or $-x_i$.

1's in all positions
such that this literal
makes the clause true.

All other positions are 0.

Pictures of Integers for Clauses



For the i -th clause

Example: Base-32 Integers

$$(x + y + z)(x + -y + -z)$$

- $c = 2; v = 3.$
- Assume x, y, z are variables 1, 2, 3, respectively.
- Clauses are 1, 2 in order given.

Example: $(x + y + z)(x + -y + -z)$

- For x: 00111
- For -x: 00100
- For y: 01001
- For -y: 01010
- For z: 10001
- For -z: 10010
- For first clause:
00005, 00006,
00007
- For second clause:
00050, 00060,
00070

The Budget

- $K = 8(1+32+32^2+\dots+32^{c-1}) + 32^c(1+32+32^2+\dots+32^{v-1})$



- That is, 8 for the position of each clause and 1 for the position of each variable.
- **Key Point:** there can be no carries between positions.

Key Point: Details

- Among all the integers, the sum of digits in the position for a variable is 2.
- And for a clause, it is $1+1+1+5+6+7 = 21$.
 - 1's for the three literals in the clause; 5, 6, and 7 for the integers for that clause.
- Thus, the budget must be satisfied on a digit-by-digit basis.

Key Point: Concluded

- Thus, if a set of integers matches the budget, it must include exactly one of the integers for x and $-x$.
- For each clause, at least one of the integers for literals must have a 1 there, so we can choose either 5, 6, or 7 to make 8 in that position.

Proof the Reduction Works

- Each integer can be constructed from the 3SAT instance F in time proportional to its length.
 - Thus, reduction is $O(n^2)$.
- If F is satisfiable, take a satisfying assignment A .
- Pick integers for those literals that A makes true.

Proof the Reduction Works – (2)

- The selected integers sum to between 1 and 3 in the digit for each clause.
- For each clause, choose the integer with 5, 6, or 7 in that digit to make a sum of 8.
- These selected integers sum to exactly the budget.

Proof: Converse

- We must also show that a sum of integers equal to the budget k implies F is satisfiable.
- In each digit for a variable x , either the integer for x or the digit for $-x$, but not both is selected.
 - let truth assignment A make this literal true.

Proof: Converse – (2)

- In the digits for the clauses, a sum of 8 can only be achieved if among the integers for the variables, there is at least one 1 in that digit.
- Thus, truth assignment A makes each clause true, so it satisfies F.

The *Partition* Problem

- Given a list of integers L , can we partition it into two disjoint sets whose sums are equal?
 - E.g., $L = (3, 4, 5, 6)$.
 - Yes: $3 + 6 = 4 + 5$.
- Partition is NP-complete; reduction from Subset Sum.

Reduction of Subset Sum to Partition

- Given instance (S, K) of Subset Sum, compute the sum total, T , of all the integers in S .
 - Linear in input size.
- Output is S followed by two integers: $2K$ and T .
- **Example:** $S = \{3, 4, 5, 6\}$; $K = 7$.
 - Partition instance = $(3, 4, 5, 6, 14, 18)$.

Proof That Reduction Works

- The sum of all integers in the output instance is $2(T+K)$.
 - Thus, the two partitions must each sum to exactly $T + K$.
- If the input instance has a subset, S' , of S that sums to K , then pick it plus the integer T to solve the output Partition instance:
 - $T + S' = T + K = (T - K) + 2K = (T - S') + 2K$

Proof: Converse

- Suppose the output instance of Partition has a solution.
- The integers T and $2K$ cannot be in the same partition.
 - Because their sum is more than half $2(T+K)$.
- Thus, the subset, S' , of S that is in the partition with T sums to K :
 - $T + S' = (T - S') + 2K$; Hence, $2S' = 2K$.
 - Thus, $S' = K$, i.e., it solves Subset Sum.