

NP-completeness:

- Recall: decision problem D is "NP-complete" iff
 1. D in NP
 2. D is "NP-hard": for all D' in NP, $D' \leq_p D$.
- Property: If $P \neq NP$ and D is NP-complete, then $D \notin P$.
- Updated "picture of the world" with NP-hard extending beyond NP but intersecting with it (the intersection is "NP-complete").

Cook's Theorem: [properly Cook-Levin Theorem]

- * Circuit-SAT: Given a circuit with a single output gate, is there some setting of the inputs that will make the output equal to 1?
- * SAT: Given a propositional formula ϕ (written using propositional connectives negation, and, or, implication), is there some setting of the variables that will make ϕ true (in which case ϕ is said to be "satisfiable")?
- * CNF-SAT: Given a propositional formula ϕ in Conjunctive Normal Form (also called product of sums), is ϕ satisfiable?
 Note this means ϕ has the form $C_1 \wedge C_2 \wedge \dots \wedge C_k$, where each "clause" $C_i = a_1 \vee a_2 \vee \dots \vee a_r$, where each "literal" a_j is either a variable (x) or negated variable ($\neg x$). For example:
 $(x_1 \vee \neg x_2) \wedge \neg x_3 \wedge (\neg x_1 \vee x_2 \vee x_3 \vee x_2)$
- * 3SAT: Given a propositional formula ϕ in 3-CNF (CNF where each clause contains exactly 3 literals), is ϕ satisfiable?
- * Cook-Levin Theorem: SAT is NP-complete.

- SAT in NP:

Given ϕ, c , where c is a setting of values (True/False) for the variables of ϕ :

Output the value of ϕ under the setting given by c . This can be carried out in polynomial time: given a formula ϕ and a setting of its variables, just substitute the values for each variable and then evaluate each connective one-by-one, from the inside out. Moreover, if ϕ is satisfiable, then there is some value of c that will make this verifier output yes (when $c =$ a setting that makes ϕ true); and if ϕ is not satisfiable, then this verifier will output "no" for every possible value of c (since no setting makes ϕ true).

The same reasoning shows that CNF-SAT and 3SAT also belong to NP.

- SAT is NP-hard (main idea):

Let D be any problem in NP. By definition, there is a polytime verifier $V(x, c)$ for D . This polytime verifier can be implemented as a circuit with input gates representing the values of x and c . For any input x for D , we can hard-code the value of x into this circuit in such a way that there is a value of the certificate for which the verifier outputs "yes" iff there is some setting of the input gates corresponding to c that make the circuit output 1. It's possible to

show that this transformation can be carried out in polynomial time (as a function of the size of x), and it's also possible to show that this circuit can then be translated into a formula in CNF (in polytime) such that settings of the circuit's input gates correspond to settings of the formula's variables.

This shows directly that CNF-SAT and SAT are both NP-hard. It leaves open the question for 3SAT, for now...

NP-hardness:

- In general, how do we show decision problem D is NP-hard? Don't want to re-prove Cook's Theorem from scratch for each problem!
- Note: $-p >$ is transitive -- if $A -p > B$ and $B -p > C$, then $A -p > C$.
- To show D is NP-hard, it is sufficient to find some NP-hard problem D' and prove $D' -p > D$ because D' NP-hard implies for all D'' in NP, $D'' -p > D'$ so $D'' -p > D$ (by transitivity of $-p >$).

NP-completeness examples

- SUBSET-SUM: Given a finite set of positive integers S and a positive integer target t , is there some subset S' of S whose sum is exactly t , i.e., $\exists S' \subseteq S, \sum_{x \in S'} x = t$?
- SS is NPc:
 SS in NP because it takes polytime to verify that the certificate represents a subset of S whose sum is t (addition of two numbers takes linear time; addition of k numbers takes time proportional to the sum of the bit-lengths of all the numbers).
 SS is NP-hard because $3SAT -p > SS$:
 Given formula $\phi = (a_1 \vee b_1 \vee c_1) \wedge \dots \wedge (a_r \vee b_r \vee c_r)$ where $a_i, b_i, c_i \in \{x_1, \neg x_1, \dots, x_s, \neg x_s\}$, construct numbers as follows:
 - . For $j = 1, \dots, s$,
 number $y_{\{2j-1\}} = 1$ followed by $s-j$ 0s followed by r digits where k -th next digit equals 1 if x_j appears in clause C_k , 0 otherwise (corresponds to literal x_j);
 number $y_{\{2j\}} = 1$ followed by $s-j$ 0s followed by r digits where k -th next digit equals 1 if $\neg x_j$ appears in clause C_k , 0 otherwise (corresponds to literal $\neg x_j$).
 - . For $j = 1, \dots, r$,
 number $y_{\{2s+2j-1\}} = 1$ followed by $r-j$ 0s and
 number $y_{\{2s+2j\}} = 2$ followed by $r-j$ 0s
 (both correspond to clause C_j).
 - . Target $t = s$ 1s followed by r 4s.
 Clearly, this can be constructed in polytime.

Example of reduction for

$\phi = (x_1 \vee \neg x_2 \vee \neg x_4) \wedge (x_2 \vee \neg x_3 \vee x_1) \wedge (\neg x_3 \vee x_4 \vee \neg x_2)$:

$S = \{$

$y_{01} = 1000110,$	[corresponds to x_1]
$y_{02} = 1000000,$	[corresponds to $\neg x_1$]
$y_{03} = 100010,$	[corresponds to x_2]
$y_{04} = 100101,$	[corresponds to $\neg x_2$]
$y_{05} = 10000,$	[corresponds to x_3]
$y_{06} = 10011,$	[corresponds to $\neg x_3$]
$y_{07} = 1001,$	[corresponds to x_4]
$y_{08} = 1100,$	[corresponds to $\neg x_4$]
$y_{09} = 200,$	[corresponds to C_1]
$y_{10} = 100,$	[corresponds to C_1]

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y_11 =      20,  [corresponds to  C2]
y_12 =      10,  [corresponds to  C2]
y_13 =       2,  [corresponds to  C3]
y_14 =       1}  [corresponds to  C3]
t = 1111444

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If ϕ is satisfiable, then there is a setting of variables such that each clause of ϕ contains at least one true literal. Consider the subset $S' = \{\text{numbers that correspond to true literals}\}$. By construction, $\text{SUM}_{\{x \in S'\}} x = s$ 1s followed by r digits, each one of which is either 1, 2, or 3 (because each clause contains at least one true literal). This means it is possible to add suitable numbers from $\{C_1, D_1, \dots, C_r, D_r\}$ so that the last r digits of the sum are equal to 4, i.e., there is a subset S' such that $\text{SUM}_{\{x \in S'\}} x = t$.

If there is a subset S' of S such that $\text{SUM}_{\{x \in S'\}} x = t$, then S' must contain exactly one of $\{x_j, \sim x_j\}$ for $j = 1, \dots, n$, because that is the only way for the numbers in S' to add to the target (with a 1 in the first s digits). Then, ϕ is satisfied by setting each variable according to the numbers in S' : for each clause j , the corresponding digit in the target is equal to 4 but the numbers C_j and D_j together only add up to 3 in that digit; this means that the selection of numbers in S' must include some literal with a 1 in that digit, i.e., clause j contains at least one true literal.

- VERTEX-COVER:

Input: Undirected graph $G = (V, E)$, positive integer k .

Output: Does G contain a vertex cover of size k , i.e., a subset C of k vertices such that each edge of G has at least one endpoint in C ?

- VERTEX-COVER (VC) is NPc:

VC in NP: Given G, k, c , verify in polytime that c represents a vertex cover of size k in G .

VC is NP-hard: 3SAT \rightarrow VC.

Given $\phi = (a_1 \vee b_1 \vee c_1) \wedge \dots \wedge (a_r \vee b_r \vee c_r)$, where a_i, b_i, c_i in $\{x_1, \sim x_1, x_2, \sim x_2, \dots, x_s, \sim x_s\}$, construct $G=(V, E)$ and k such that ϕ satisfiable iff G contains vertex cover of size k , as follows:

$$k = s + 2r$$

$$V = \{ a_1, b_1, c_1, \dots, a_r, b_r, c_r, x_1, \sim x_1, \dots, x_s, \sim x_s \}$$

$$E = \{ (x_i, \sim x_i) : 1 \leq i \leq s \} \cup$$

$$\{ (a_i, b_i), (b_i, c_i), (c_i, a_i) : 1 \leq i \leq r \} \cup$$

$$\{ (l, x) : l = a_i \text{ or } b_i \text{ or } c_i, \text{ and } x = x_j \text{ or } \sim x_j \text{ corresponding to } l \}$$

For example, if

$\phi = (x_1 \vee \sim x_2 \vee \sim x_4) \wedge (x_2 \vee \sim x_3 \vee x_1) \wedge (\sim x_3 \vee x_4 \vee \sim x_2)$,
then $a_1=x_1, b_1=\sim x_2, c_1=\sim x_4, a_2=x_2, b_2=\sim x_3, c_2=x_1, a_3=\sim x_3, b_3=x_4, c_3=\sim x_2$
so $k = 4 + 2*3 = 10$

$$V = \{a_1, b_1, c_1, a_2, b_2, c_2, a_3, b_3, c_3, x_1, \sim x_1, x_2, \sim x_2, x_3, \sim x_3, x_4, \sim x_4\}$$

$$E = \{ (x_1, \sim x_1), (x_2, \sim x_2), (x_3, \sim x_3), (x_4, \sim x_4), \\ (a_1, b_1), (b_1, c_1), (c_1, a_1), (a_1, x_1), (b_1, \sim x_2), (c_1, \sim x_4), \\ (a_2, b_2), (b_2, c_2), (c_2, a_2), (a_2, x_2), (b_2, \sim x_3), (c_2, x_1), \\ (a_3, b_3), (b_3, c_3), (c_3, a_3), (a_3, \sim x_3), (b_3, x_4), (c_3, \sim x_2) \}$$

Clearly, construction can be done in polytime (with one scan of ϕ).

Also, if ϕ is satisfiable, then there is an assignment of truth values that make at least one literal in each clause true. Pick a cover C as follows: for each variable, C contains x_i or $\sim x_i$, whichever is true under the truth assignment; for each clause, C contains every literal except one that's true (pick arbitrarily if more than one true literal).

C contains exactly $s+2r$ vertices and is a cover: all edges $(x_i, \sim x_i)$ are covered; all edges in clause triangles are covered (because we picked two vertices from each triangle); all edges between "clauses" and "variables" are covered (two from inside triangle, one from true literal for that clause).

Finally if G contains a cover C of size $k=s+2r$, C must contain at least one of x_i or $\sim x_i$ for each i (because of edges $(x_i, \sim x_i)$) and at least two of a_i, b_i, c_i for each i (because of triangle), so only way for C to have size $s+2r$ is to contain exactly one of x_i or $\sim x_i$ and exactly two of a_i, b_i, c_i , for each i . Since C covers all edges with only two vertices per triangle, the third vertex in each triangle must have its "outside" edge covered because of x_i or $\sim x_i$. If we set literals according to choices of x_i or $\sim x_i$ in C , this will make formula ϕ true: at least one literal will be true in each clause (because at least one edge from "variables" to "clauses" is covered by the variable in C).

The material below was not covered during lectures -- it is provided here for your reference.

Extra example: 3SAT is NPc.

3SAT in NP because it's a special case of SAT.

CNF-SAT \rightarrow 3SAT:

Given ϕ (a CNF formula), construct ϕ' (a 3-CNF formula) such that ϕ is satisfiable iff ϕ' is satisfiable, as follows. Note that it is not necessary to make ϕ and ϕ' logically equivalent in order to achieve this. For each clause C of ϕ :

- If $C = (a_1)$, then replace C with $(a_1 \vee a_1 \vee a_1)$.
- If $C = (a_1 \vee a_2)$, then replace C with $(a_1 \vee a_1 \vee a_2)$.
- If $C = (a_1 \vee a_2 \vee a_3)$, then leave C the same.
- If $C = (a_1 \vee a_2 \vee \dots \vee a_r)$ where $r > 3$, then replace C with $(a_1 \vee a_2 \vee z_1) \wedge (\sim z_1 \vee a_3 \vee z_2) \wedge (\sim z_2 \vee a_4 \vee z_3) \wedge \dots \wedge (\sim z_{r-4} \vee a_{r-2} \vee z_{r-3}) \wedge (\sim z_{r-3} \vee a_{r-1} \vee a_r)$, where z_1, z_2, \dots, z_{r-3} are new variables (not in ϕ).

For example, if

$\phi = (x_1 \vee x_2) \wedge (\sim x_1) \wedge (x_2 \vee \sim x_3 \vee x_3 \vee x_5 \vee \sim x_4)$

then

$\phi' = (x_1 \vee x_1 \vee x_2) \wedge (\sim x_1 \vee \sim x_1 \vee \sim x_1) \wedge (x_2 \vee \sim x_3 \vee z_3) \wedge (\sim z_3 \vee x_3 \vee z_4) \wedge (\sim z_4 \vee x_5 \vee \sim x_4)$

Clearly, this transformation can be carried out in polytime: at most, each clause of length r gets replaced with $O(r)$ 3-clauses using $O(r)$ new variables.

Also, if ϕ is satisfiable, then there is an assignment of truth values to the variables of ϕ that makes at least one literal true in each clause of ϕ . This assignment can be extended to include values for the new variables of ϕ' that will make each clause of ϕ' true:

- For 1-/2-/3-clauses of ϕ with at least one true literal, the corresponding clause in ϕ' is also true because it contains the same literals, at least one of which is true.
- For r -clauses of ϕ with at least one true literal, say the original

clause is $(a_1 \vee a_2 \vee \dots \vee a_r)$ and the true literal is a_i . Then pick values for the new variables as follows:

- . if $i=1$ or $i=r$, then $(a_1 \vee a_2 \vee z_1)$ is satisfied so pick $z_1 = z_2 = \dots = z_{r-3} = \text{false}$ to satisfy every other clause;
- . if $i=r-1$ or $i=r$, then $(\neg z_{r-3} \vee a_{r-1} \vee a_r)$ is satisfied so pick $z_1 = z_2 = \dots = z_{r-3} = \text{true}$ to satisfy every other clause;
- . if $2 < i < r-1$, then $(\neg z_{i-2} \vee a_i \vee z_{i-1})$ is satisfied so pick $z_1 = z_2 = \dots = z_{i-2} = \text{true}$ to satisfy the first $i-2$ clauses and pick $z_{i-1} = z_i = \dots = z_{r-3} = \text{false}$ to satisfy the last $r-i-1$ clauses.

For example, if $x_3 = \text{true}$ satisfies $(x_2 \vee \neg x_3 \vee x_3 \vee x_5 \vee \neg x_4)$, then pick $z_1 = \text{true}$ and $z_2 = \text{false}$ to satisfy

$(x_2 \vee \neg x_3 \vee z_1) \wedge (\neg z_1 \vee x_3 \vee z_2) \wedge (\neg z_2 \vee x_5 \vee \neg x_4)$

(the first clause is satisfied by $z_1 = \text{true}$, the second clause is satisfied by $x_3 = \text{true}$, the last clause is satisfied by $z_2 = \text{false}$).

Finally, if ϕ' is satisfiable, then the assignment of values to the variables of ϕ' must include values to the variables of ϕ that satisfy ϕ :

- If the new clauses $(a_1 \vee a_2 \vee z_1) \wedge (\neg z_1 \vee a_3 \vee z_2) \wedge (\neg z_2 \vee a_4 \vee z_3) \wedge \dots \wedge (\neg z_{r-4} \vee a_{r-2} \vee z_{r-3}) \wedge (\neg z_{r-3} \vee a_{r-1} \vee a_r)$ are satisfied, then let z_i be the first new variable set to false (so either $i = 1$ or $z_1 = z_2 = \dots = z_{i-1} = \text{true}$):
 - . if $i = 1$, then $(a_1 \vee a_2 \vee z_1)$ can only be satisfied by setting $a_1 = \text{true}$ or $a_2 = \text{true}$;
 - . if $i > 1$, then $(\neg z_{i-1} \vee a_{i+1} \vee z_i)$ can only be satisfied by setting $a_{i+1} = \text{true}$;
 in all cases, one of the original literals must be set to true so the original clause $(a_1 \vee a_2 \vee \dots \vee a_r)$ is also satisfied.
- If the new clause $(a_1 \vee a_2 \vee a_3)$ is satisfied, then the original clause is also satisfied because it's the same, and similarly for the new clauses $(a_1 \vee a_1 \vee a_2)$ and $(a_1 \vee a_1 \vee a_1)$, because they are logically equivalent to the original clauses.

We have shown that any CNF formula ϕ can be transformed in polytime to a 3-CNF formula ϕ' such that ϕ is satisfiable iff ϕ' is satisfiable; this completes the polytime reduction from CNF-SAT to 3SAT.

Note: Careful with directions! Trivially, $3\text{SAT} \rightarrow \text{CNF-SAT}$ (3SAT is special case of CNF-SAT). But in this case, we need other direction, transforming instances of general problem into instances of restricted problem.

For Next Week

- * Readings: No readings in textbook for next week.
- * Self-Test: Think about exercises 8.1 and 8.2.