

NP and NP-complete

So far we have been focusing on algorithms.

What about hardness?

Example: Any comparison-based sorting algorithm must take $\Omega(n \log n)$ time.

However, there are many problems in a gray area:

- we do not know poly-time algorithms. $\Leftrightarrow$ runtime = $O(n^c)$ for some $c = O(1)$
- we cannot prove there are no poly-time algorithms.

A set of problems that are "equivalent":

if there exists poly-time algorithm for one of them,
then there exist poly-time algorithms for all of them.

Decision vs. optimization:

Example: What is the length of the shortest path from s to t ?

vs.

Is there a path from s to t with length $\leq k$?
we are going to work with the decision version.

Polynomial-Time Reductions.

Reduction: a method for solving one problem using another.

Poly-time reduction: For two problems X and Y , we say $X \leq_p Y$

read as "X is poly-time reducible to Y"
"X is at most as hard as Y"
(w.r.t poly-time).

iff there is a poly-time algorithm that
can transform instances of problem X
into instances of problem Y such that
the answers to both instances are always
the same.

input of the reduction
output of the reduction

Corollary: If X can be solved in poly-time,
then so can Y .

Example of " $\leq_p$ "

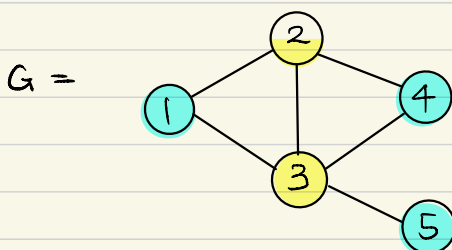
Vertex Cover: given a graph G and an integer k ,
decide if G has a vertex cover of
size $\leq k$.

Definition (vertex cover): a set S of vertices such that
every edge has at least one endpoint in S

Independent Set: given a graph H and an integer ℓ ,
decide if H has an independent set of size $\geq \ell$.

Definition (independent set): a set S of vertices such that
there are no edges between vertices in S .

Theorem: **Vertex Cover (VC)** $\leq_p$ **Independent Set (IS)**



$VC(G, 2)?$ YES!
 $\{2, 3\}$ is a VC.
 $\Updownarrow$
 $IS(G, 3)?$ YES!
 $\{1, 4, 5\}$ is an IS

Proof: we show that S is a vertex cover
if and only if $V-S$ is an independent set.

S : VC

$V-S$: IS

S is a VC

$\Updownarrow$

every edge must have
 ≥ 1 endpoint in S

$\Updownarrow$

no edge has both
endpoints in $V-S$

$\Updownarrow$

$V-S$ is an IS

$VC \leq_p IS$:

we are given
a VC instance
 (G, k)

$\rightarrow$

a reduction
 $VC \leq_p IS$

$H \leftarrow G$
 $\ell \leftarrow n-k$

$\rightarrow (H, \ell)$

an IS instance
that always has the
same answer.

P vs. NP.

Both are complexity classes.

P: all decision problems that can be solved (deterministically) in polynomial time.

NP: all decision problems for which the "yes" instances have proofs that be verified in (deterministic) polynomial time.

Example: (the decision version of)

MST
Shortest path
Maxflow
Sorting

} $\in P$.

(the decision version of)

Vertex cover
Independent set

} $\in NP$.

Theorem: Vertex Cover $\in NP$.

Proof: If Peggy wants to convince Victor the answer to $VC(G, k)$ is "yes"

Peggy can simply show a vertex cover of size $\leq k$.

proof: $S \subseteq V$ with $|S| \leq k$

verification: Victor can check every edge $e \in E$.

to see if e has at least one endpoint in S .

Theorem: $P \subseteq NP$.

Proof:

proof = $\emptyset$.

verification: solve the instance and verify the answer is yes.

Open Question: $P = NP$?

NP-Complete: ^(NPC) All decision problems X such that.

① $X \in NP$

② $\forall Y \in NP, Y \leq_p X$.

Intuitively, NPC contains the hardest problems in NP.

Lemma. If $X \in NPC$, $Y \in NP$, and $X \leq_p Y$,
then $Y \in NPC$.

Proof. ① $Y \in NP$.

② $\forall Z \in NP, Z \leq_p X$ (because X is NPC).

then $Z \leq_p Y$ (If $Z \leq_p X$ and $X \leq_p Y$, then $Z \leq_p Y$)

An example of NP-Complete problems: 3-SAT.

3-SAT. Input: n boolean variables $x_1, \dots, x_n$.
 m clauses $C_1, \dots, C_m$.

Output: "YES" iff there is an assignment
 $x_i \rightarrow \{0, 1\}$
that satisfies all clauses simultaneously.

(Each clause is the OR " $\vee$ "
of three literals.
Literal: $x_i, \bar{x}_i$ $\leftarrow$ "not x_i ".)

Example: $n=4$ $m=3$

$$C_1 = x_1 \vee \bar{x}_2 \vee x_3$$

$$C_2 = \bar{x}_1 \vee \bar{x}_3 \vee x_4$$

$$C_3 = \bar{x}_1 \vee \bar{x}_3 \vee \bar{x}_4$$

Answer = "YES", one solution is

$$x_1 = 1, x_3 = 0$$

x_2 and x_4 can take any value.

Problems harder than NP?

Generalized Chess $\notin NP$.

Input: An $n \times n$ chess board position (with natural generalized chess rules)

Output: Black moves first. Output "YES" iff Black can win.