## Algorithms \& Models of Computation

 CS/ECE 374 B, Spring 2020
## NP and NP Completeness

Lecture 23
Wednesday, April 29, 2020

## Part I

## NP-Completeness

## NP: Non-deterministic polynomial

## Definition

A decision problem is in NP, if it has a polynomial time certifier, for all the all the YES instances.

## Definition

A decision problem is in co-NP, if it has a polynomial time certifier, for all the all the NO instances.

## Example

(1) 3SAT is in NP.
(2) But Not3SAT is in co-NP.

## In the beginning...



## In the beginning...

Undecidable

## In the beginning...

## Undecidable



## In the beginning...



## In the beginning...



## In the beginning...



## In the beginning...



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## In the beginning...



## In the beginning...



## "Hardest" Problems

## Question

What is the hardest problem in NP? How do we define it?

## Towards a definition

(1) Hardest problem must be in NP.
(2) Hardest problem must be at least as "difficult" as every other problem in NP.

## NP-Complete Problems

## Definition

A problem $X$ is said to be NP-Complete if
(1) $X \in N P$, and
(2) (Hardness) For any $\mathbf{Y} \in \mathbf{N P}, \mathbf{Y} \leq_{P} \mathbf{X}$.

## Solving NP-Complete Problems

## Proposition

Suppose $\boldsymbol{X}$ is NP-Complete. Then $\boldsymbol{X}$ can be solved in polynomial time if and only if $\mathrm{P}=\mathrm{NP}$.

## Proof.

$\Rightarrow$ Suppose $X$ can be solved in polynomial time
(0) Let $\boldsymbol{Y} \in \mathrm{NP}$. We know $\mathbf{Y} \leq_{p} \mathbf{X}$.
(2) We showed that if $Y \leq_{P} \mathbf{X}$ and $\boldsymbol{X}$ can be solved in polynomial time, then $\boldsymbol{Y}$ can be solved in polynomial time.
(3) Thus, every problem $\boldsymbol{Y} \in \mathbf{N P}$ is such that $\boldsymbol{Y} \in P ; N P \subseteq P$.
(c) Since $\mathbf{P} \subseteq N P$, we have $\mathbf{P}=\mathbf{N P}$.
$\Leftarrow$ Since $\mathbf{P}=\mathbf{N P}$, and $X \in \mathbf{N P}$, we have a polynomial time algorithm for $\boldsymbol{X}$.

## NP-Hard Problems

## Definition

A problem $X$ is said to be NP-Hard if
(1) (Hardness) For any $Y \in N P$, we have that $Y \leq_{P} \mathbf{X}$.

An NP-Hard problem need not be in NP!

Example: Halting problem is NP-Hard (why?) but not NP-Complete.

## Consequences of proving NP-Completeness

If $X$ is NP-Complete
(1) Since we believe $\mathbf{P} \neq \mathrm{NP}$,
(2) and solving $X$ implies $P=N P$.
$X$ is unlikely to be efficiently solvable.

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$\boldsymbol{X}$ is unlikely to be efficiently solvable.
At the very least, many smart people before you have failed to find an efficient algorithm for $\boldsymbol{X}$.
(This is proof by mob opinion - take with a grain of salt.)

## NP-Complete Problems

## Question

Are there any problems that are NP-Complete?

Answer
Yes! Many, many problems are NP-Complete.

## Cook-Levin Theorem

## Theorem (Cook-Levin)

## SAT is NP-Complete.

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## Theorem (Cook-Levin)

## SAT is NP-Complete.

Need to show
(1) SAT is in NP.
(2) every NP problem $X$ reduces to SAT.

Will see proof in next lecture.

Steve Cook won the Turing award for his theorem.

## Proving that a problem X is NP-Complete

To prove $\boldsymbol{X}$ is NP-Complete, show
(1) Show that $\boldsymbol{X}$ is in NP.
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SAT $\leq_{p} X$ implies that every NP problem $Y \leq_{p} X$. Why? Transitivity of reductions:
$Y \leq_{P} S A T$ and $S A T \leq_{P} X$ and hence $Y \leq_{P} X$.

## is NP-Complete

- 3-SAT is in NP
- SAT $\leq_{p}$ 3-SAT as we saw


## NP-Completeness via Reductions

(1) SAT is NP-Complete due to Cook-Levin theorem
(2) SAT $\leq_{P} 3-\mathrm{SAT}$
(3) 3-SAT $\leq_{p}$ Independent Set
(4) Independent Set $\leq_{P}$ Vertex Cover
(5) Independent Set $\leq_{P}$ Clique
(6) 3-SAT $\leq_{P}$ 3-Color
(3) 3-SAT $\leq_{P}$ Hamiltonian Cycle

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(0) 3-SAT $\leq_{p} 3$-Color
(0) 3-SAT $\leq_{P}$ Hamiltonian Cycle

Hundreds and thousands of different problems from many areas of science and engineering have been shown to be NP-Complete.

A surprisingly frequent phenomenon!

## Part II

## Reducing 3-SAT to Independent Set

## Independent Set

## Problem: Independent Set

Instance: A graph G, integer $k$.
Question: Is there an independent set in $G$ of size $k$ ?

## 3 SAT $\leq_{p}$ Independent Set

## The reduction 3 SAT $\leq_{\mathrm{p}}$ Independent Set

Input: Given a 3CNF formula $\varphi$
Goal: Construct a graph $\boldsymbol{G}_{\varphi}$ and number $k$ such that $\boldsymbol{G}_{\varphi}$ has an independent set of size $k$ if and only if $\varphi$ is satisfiable.

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Importance of reduction: Although 3SAT is much more expressive, it can be reduced to a seemingly specialized Independent Set problem.

Notice: We handle only 3CNF formulas - reduction would not work for other kinds of boolean formulas.

## Interpreting 3SAT

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(2) Pick a literal from each clause and find a truth assignment to make all of them true. You will fail if two of the literals you pick are in conflict, i.e., you pick $x_{i}$ and $\neg x_{i}$
We will take the second view of 3SAT to construct the reduction.

## The Reduction

(1) $G_{\varphi}$ will have one vertex for each literal in a clause


Figure: Graph for $\varphi=\left(\neg x_{1} \vee x_{2} \vee x_{3}\right) \wedge\left(x_{1} \vee \neg x_{2} \vee x_{3}\right) \wedge\left(\neg x_{1} \vee x_{2} \vee x_{4}\right)$

## The Reduction

(1) $G_{\varphi}$ will have one vertex for each literal in a clause
(2) Connect the 3 literals in a clause to form a triangle; the independent set will pick at most one vertex from each clause, which will correspond to the literal to be set to true


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(3) Connect 2 vertices if they label complementary literals; this ensures that the literals corresponding to the independent set do not have a conflict


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(0) Connect 2 vertices if they label complementary literals; this ensures that the literals corresponding to the independent set do not have a conflict
(9) Take $k$ to be the number of clauses


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## Correctness

## Proposition

$\varphi$ is satisfiable iff $G_{\varphi}$ has an independent set of size $\boldsymbol{k}$ (= number of clauses in $\varphi$ ).

## Proof.

$\Rightarrow$ Let $a$ be the truth assignment satisfying $\varphi$

## Correctness

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## Proof.

$\Rightarrow$ Let $a$ be the truth assignment satisfying $\varphi$
(1) Pick one of the vertices, corresponding to true literals under a, from each triangle. This is an independent set of the appropriate size. Why?

## Correctness (contd)

## Proposition

$\varphi$ is satisfiable iff $G_{\varphi}$ has an independent set of size $\boldsymbol{k}$ (= number of clauses in $\varphi$ ).

## Proof.

$\Leftarrow$ Let $S$ be an independent set of size $k$
(1) $S$ must contain exactly one vertex from each clause
(2) $S$ cannot contain vertices labeled by conflicting literals
(3) Thus, it is possible to obtain a truth assignment that makes in the literals in $S$ true; such an assignment satisfies one literal in every clause

## Part III

## NPCompleteness of Hamiltonian Cycle

## Directed Hamiltonian Cycle

Input Given a directed graph $G=(V, E)$ with $n$ vertices Goal Does $G$ have a Hamiltonian cycle?


## Directed Hamiltonian Cycle

Input Given a directed graph $G=(V, E)$ with $n$ vertices Goal Does $G$ have a Hamiltonian cycle?

- A Hamiltonian cycle is a cycle in the graph that visits every vertex in $G$ exactly once



## Is the following graph Hamiltonianan?


(A) Yes.
(B) No.

## Directed Hamiltonian Cycle is NP-Complete

- Directed Hamiltonian Cycle is in NP: exercise
- Hardness: We will show 3-SAT $\leq_{P}$ Directed Hamiltonian Cycle


## Reduction

Given 3-SAT formula $\varphi$ create a graph $G_{\varphi}$ such that

- $G_{\varphi}$ has a Hamiltonian cycle if and only if $\varphi$ is satisfiable
- $G_{\varphi}$ should be constructible from $\varphi$ by a polynomial time algorithm $\mathcal{A}$

Notation: $\varphi$ has $n$ variables $x_{1}, x_{2}, \ldots, x_{n}$ and $m$ clauses
$C_{1}, C_{2}, \ldots, C_{m}$.

## Reduction: First Ideas

- Viewing SAT: Assign values to $\boldsymbol{n}$ variables, and each clauses has 3 ways in which it can be satisfied.
- Construct graph with $2^{\boldsymbol{n}}$ Hamiltonian cycles, where each cycle corresponds to some boolean assignment.
- Then add more graph structure to encode constraints on assignments imposed by the clauses.


## The Reduction: Phase I

- Traverse path $\boldsymbol{i}$ from left to right iff $x_{i}$ is set to true
- Each path has $\mathbf{3}(\boldsymbol{m}+1)$ nodes where $\boldsymbol{m}$ is number of clauses in $\varphi$; nodes numbered from left to right ( 1 to $3 m+3$ )



## The Reduction: Phase II

- Add vertex $\boldsymbol{c}_{\boldsymbol{j}}$ for clause $\boldsymbol{C}_{\boldsymbol{j}} . \boldsymbol{c}_{\boldsymbol{j}}$ has edge from vertex $3 \boldsymbol{j}$ and to vertex $3 j+1$ on path $\boldsymbol{i}$ if $\boldsymbol{x}_{\boldsymbol{i}}$ appears in clause $C_{j}$, and has edge from vertex $3 j+1$ and to vertex $3 j$ if $\neg x_{i}$ appears in $C_{j}$.

$$
x_{1} \vee \neg x_{2} \vee x_{4} \quad \neg x_{1} \vee \neg x_{2} \vee \neg x_{3}
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## Correctness Proof

## Proposition

$\varphi$ has a satisfying assignment iff $G_{\varphi}$ has a Hamiltonian cycle.

## Proof.

$\Rightarrow$ Let $\boldsymbol{a}$ be the satisfying assignment for $\varphi$. Define Hamiltonian cycle as follows

- If $\boldsymbol{a}\left(\boldsymbol{x}_{\boldsymbol{i}}\right)=\mathbf{1}$ then traverse path $\boldsymbol{i}$ from left to right
- If $\boldsymbol{a}\left(\boldsymbol{x}_{\boldsymbol{i}}\right)=\mathbf{0}$ then traverse path $\boldsymbol{i}$ from right to left
- For each clause, path of at least one variable is in the "right" direction to splice in the node corresponding to clause


## Hamiltonian Cycle $\Rightarrow$ Satisfying assignment

Suppose $\boldsymbol{\Pi}$ is a Hamiltonian cycle in $\boldsymbol{G}_{\varphi}$

- If $\Pi$ enters $c_{j}$ (vertex for clause $C_{j}$ ) from vertex $3 j$ on path $i$ then it must leave the clause vertex on edge to $3 j+\mathbf{1}$ on the same path i
- If not, then only unvisited neighbor of $\mathbf{3 j + 1}$ on path $\boldsymbol{i}$ is $\mathbf{3 j + 2}$
- Thus, we don't have two unvisited neighbors (one to enter from, and the other to leave) to have a Hamiltonian Cycle
- Similarly, if $\boldsymbol{\Pi}$ enters $c_{j}$ from vertex $3 j+\mathbf{1}$ on path $\boldsymbol{i}$ then it must leave the clause vertex $c_{j}$ on edge to $3 j$ on path $i$


## Example



## Hamiltonian Cycle $\Longrightarrow$ Satisfying assignment (contd)

- Thus, vertices visited immediately before and after $C_{i}$ are connected by an edge
- We can remove $\boldsymbol{c}_{\boldsymbol{j}}$ from cycle, and get Hamiltonian cycle in $G-c_{j}$
- Consider Hamiltonian cycle in $G-\left\{c_{1}, \ldots c_{m}\right\}$; it traverses each path in only one direction, which determines the truth assignment


## Hamiltonian Cycle

## Problem

## Input Given undirected graph $G=(V, E)$

Goal Does $G$ have a Hamiltonian cycle? That is, is there a cycle that visits every vertex exactly one (except start and end vertex)?

## NP-Completeness

Theorem
Hamiltonian cycle problem for undirected graphs is NP-Complete.

## Proof.

- The problem is in NP; proof left as exercise.
- Hardness proved by reducing Directed Hamiltonian Cycle to this problem


## Reduction Sketch

Goal: Given directed graph $G$, need to construct undirected graph $G^{\prime}$ such that $G$ has Hamiltonian Path iff $G^{\prime}$ has Hamiltonian path

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- A directed edge $(\boldsymbol{a}, \boldsymbol{b})$ is replaced by edge $\left(\boldsymbol{a}_{\text {out }}, \boldsymbol{b}_{\text {in }}\right)$



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## Reduction: Wrapup

- The reduction is polynomial time (exercise)
- The reduction is correct (exercise)


## Part IV

## NP-Completeness of Graph Coloring

## Graph Coloring

## Problem: Graph Coloring

Instance: $G=(V, E)$ : Undirected graph, integer $k$. Question: Can the vertices of the graph be colored using $k$ colors so that vertices connected by an edge do not get the same color?

## Graph 3-Coloring

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(4) $G$ is 2 -colorable iff $G$ is bipartite!

## Graph Coloring

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(2) $\boldsymbol{G}$ can be partitioned into $\boldsymbol{k}$ independent sets iff $\boldsymbol{G}$ is $k$-colorable.
(3) Graph 2-Coloring can be decided in polynomial time.
(4) $G$ is 2 -colorable iff $G$ is bipartite!
(5) There is a linear time algorithm to check if $G$ is bipartite using BFS (we saw this earlier).

## Graph Coloring and Register Allocation

## Register Allocation

Assign variables to (at most) $\boldsymbol{k}$ registers such that variables needed at the same time are not assigned to the same register

## Interference Graph

Vertices are variables, and there is an edge between two vertices, if the two variables are "live" at the same time.

## Observations

- [Chaitin] Register allocation problem is equivalent to coloring the interference graph with $\boldsymbol{k}$ colors
- Moreover, 3-COLOR $\leq_{p}$ k-Register Allocation, for any $k \geq 3$


## Class Room Scheduling

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(2) Reduce to Graph $\boldsymbol{k}$-Coloring problem
(3) Create graph G

- a node $\boldsymbol{v}_{\boldsymbol{i}}$ for each class $\boldsymbol{i}$
- an edge between $\boldsymbol{v}_{\boldsymbol{i}}$ and $\boldsymbol{v}_{\boldsymbol{j}}$ if classes $\boldsymbol{i}$ and $\boldsymbol{j}$ conflict


## Class Room Scheduling

(1) Given $\boldsymbol{n}$ classes and their meeting times, are $k$ rooms sufficient?
(2) Reduce to Graph $\boldsymbol{k}$-Coloring problem

- Create graph G
- a node $\boldsymbol{v}_{\boldsymbol{i}}$ for each class $\boldsymbol{i}$
- an edge between $\boldsymbol{v}_{\boldsymbol{i}}$ and $\boldsymbol{v}_{\boldsymbol{j}}$ if classes $\boldsymbol{i}$ and $\boldsymbol{j}$ conflict
(0) Exercise: $\boldsymbol{G}$ is $\boldsymbol{k}$-colorable iff $\boldsymbol{k}$ rooms are sufficient.


## Frequency Assignments in Cellular Networks

(1) Cellular telephone systems that use Frequency Division Multiple Access (FDMA) (example: GSM in Europe and Asia and AT\&T in USA)

- Breakup a frequency range $[\boldsymbol{a}, \boldsymbol{b}]$ into disjoint bands of frequencies $\left[a_{0}, b_{0}\right],\left[a_{1}, b_{1}\right], \ldots,\left[a_{k}, b_{k}\right]$
- Each cell phone tower (simplifying) gets one band
- Constraint: nearby towers cannot be assigned same band, otherwise signals will interference


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- Each cell phone tower (simplifying) gets one band
- Constraint: nearby towers cannot be assigned same band, otherwise signals will interference
(2) Problem: given $\boldsymbol{k}$ bands and some region with $\boldsymbol{n}$ towers, is there a way to assign the bands to avoid interference?
(3) Can reduce to $\boldsymbol{k}$-coloring by creating interference/conflict graph on towers.


## 3-Coloring is NP-Complete

- 3-Coloring is in NP.
- Certificate: for each node a color from $\{\mathbf{1}, \mathbf{2}, \mathbf{3}\}$.
- Certifier: Check if for each edge ( $\boldsymbol{u}, \boldsymbol{v}$ ), the color of $\boldsymbol{u}$ is different from that of $\boldsymbol{v}$.
- Hardness: We will show 3-SAT $\leq_{p}$ 3-Coloring.


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(1) $\varphi$ : Given 3SAT formula (i.e., 3 CNF formula).
(2) $\varphi$ : variables $x_{1}, \ldots, x_{n}$ and clauses $C_{1}, \ldots, C_{m}$.
(3) Create graph $G_{\varphi}$ s.t. $G_{\varphi}$ 3-colorable $\Longleftrightarrow \varphi$ satisfiable.

- encode assignment $\boldsymbol{x}_{\mathbf{1}}, \ldots, \boldsymbol{x}_{\boldsymbol{n}}$ in colors assigned nodes of $\boldsymbol{G}_{\boldsymbol{\varphi}}$.


## Reduction Idea

(1) $\varphi$ : Given 3SAT formula (i.e., 3 CNF formula).
(2) $\varphi$ : variables $x_{1}, \ldots, x_{n}$ and clauses $C_{1}, \ldots, C_{m}$.
(3) Create graph $G_{\varphi}$ s.t. $G_{\varphi}$ 3-colorable $\Longleftrightarrow \varphi$ satisfiable.

- encode assignment $\boldsymbol{x}_{\mathbf{1}}, \ldots, \boldsymbol{x}_{\boldsymbol{n}}$ in colors assigned nodes of $\boldsymbol{G}_{\varphi}$.
- create triangle with node True, False, Base


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- Need to add constraints to ensure clauses are satisfied (next phase)


## Figure



## 3 color this gadget.

## Clicker question

You are given three colors: red, green and blue. Can the following graph be three colored in a valid way (assuming the two nodes are already colored as indicated).

(A) Yes.
(B) No.

## 3 color this gadget II

## Clicker question

You are given three colors: red, green and blue. Can the following graph be three colored in a valid way (assuming the two nodes are already colored as indicated).

(A) Yes.
(B) No.

## Clause Satisfiability Gadget

(1) For each clause $C_{j}=(\boldsymbol{a} \vee \boldsymbol{b} \vee \boldsymbol{c})$, create a small gadget graph

- gadget graph connects to nodes corresponding to $\boldsymbol{a}, \boldsymbol{b}, \boldsymbol{c}$ - needs to implement OR


## Clause Satisfiability Gadget

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(2) OR-gadget-graph:


## OR-Gadget Graph

Property: if $\boldsymbol{a}, \boldsymbol{b}, \boldsymbol{c}$ are colored False in a 3-coloring then output node of OR-gadget has to be colored False.

Property: if one of $a, \boldsymbol{b}, \boldsymbol{c}$ is colored True then OR-gadget can be 3-colored such that output node of OR-gadget is colored True.

## Reduction

- create triangle with nodes True, False, Base
- for each variable $\boldsymbol{x}_{\boldsymbol{i}}$ two nodes $\boldsymbol{v}_{\boldsymbol{i}}$ and $\overline{\boldsymbol{v}}_{\boldsymbol{i}}$ connected in a triangle with common Base
- for each clause $C_{j}=(a \vee b \vee c)$, add OR-gadget graph with input nodes $a, b, c$ and connect output node of gadget to both False and Base



## Reduction



## Claim

No legal 3-coloring of above graph (with coloring of nodes $T, F, B$ fixed) in which a, b, c are colored False. If any of a, b, c are colored True then there is a legal 3-coloring of above graph.

## 3 coloring of the clause gadget



## Reduction Outline

## Example

$$
\varphi=(u \vee \neg v \vee w) \wedge(v \vee x \vee \neg y)
$$



## Correctness of Reduction

$\varphi$ is satisfiable implies $G_{\varphi}$ is 3-colorable

- if $x_{i}$ is assigned True, color $v_{i}$ True and $\bar{v}_{i}$ False


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$G_{\varphi}$ is 3-colorable implies $\varphi$ is satisfiable
- if $\boldsymbol{v}_{\boldsymbol{i}}$ is colored True then set $\boldsymbol{x}_{\boldsymbol{i}}$ to be True, this is a legal truth assignment


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- for each clause $C_{j}=(\boldsymbol{a} \vee \boldsymbol{b} \vee \boldsymbol{c})$ at least one of $a, b, c$ is colored True. OR-gadget for $C_{j}$ can be 3-colored such that output is True.
$G_{\varphi}$ is 3-colorable implies $\varphi$ is satisfiable
- if $\boldsymbol{v}_{\boldsymbol{i}}$ is colored True then set $\boldsymbol{x}_{\boldsymbol{i}}$ to be True, this is a legal truth assignment
- consider any clause $C_{j}=(\boldsymbol{a} \vee \boldsymbol{b} \vee \boldsymbol{c})$. it cannot be that all $a, b, c$ are False. If so, output of OR-gadget for $C_{j}$ has to be colored False but output is connected to Base and False!


## Graph generated in reduction...

... from 3SAT to 3COLOR
$(a \vee b \vee c) \wedge(b \vee \bar{c} \vee \bar{d}) \wedge(\bar{a} \vee c \vee d) \wedge(a \vee \bar{b} \vee \bar{d})$


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