



Computational Complexity Theory

Lecture 5: More NP-complete problems

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Recap: 3SAT is NP-complete

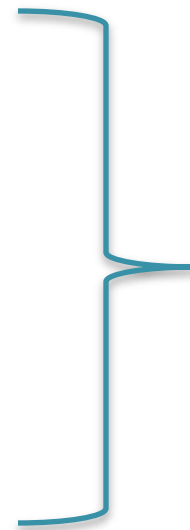
- **Definition.** A CNF is called a **k-CNF** if every clause has at most **k** literals.

e.g. a 2-CNF $\phi = (x_1 \vee x_2) \wedge (x_3 \vee \neg x_2)$

- **Definition.** **k-SAT** is the language consisting of all *satisfiable k-CNFs*.
- **Theorem.** (*Cook-Levin*) **3-SAT** is **NP-complete**.

NP complete problems: Examples

- Independent Set
- Clique
- Vertex cover
- 0/1 integer programming
- Max-Cut (NP-hard)



Karp 1972

- 3-coloring planar graphs *Stockmeyer 1973*
- 2-Diophantine solvability *Adleman & Manders 1975*

Ref: *Garey & Johnson, “Computers and Intractability” 1979*

NPC problems from number theory

- **SqRootMod**: Given natural numbers **a**, **b** and **c**, check if there exists a natural number $x \leq c$ such that
$$x^2 = a \pmod{b}.$$

- **Theorem**: **SqRootMod** is **NP-complete**.

Manders & Adleman 1976

NPC problems from number theory

- **Variant_IntFact** : Given natural numbers L , U and N , check if there exists a **natural number** $d \in [L, U]$ such that d divides N .
- **Claim:** **Variant_IntFact** is **NP-hard** under randomized poly-time reduction.
- **Reference:**
<https://cstheory.stackexchange.com/questions/4769/an-np-complete-variant-of-factoring/4785>

A peculiar NP problem

- **Minimum Circuit Size Problem (MCSP)**: Given the truth table of a Boolean function f and an integer s , check if there is a circuit of size $\leq s$ that computes f .
- Easy to see that **MCSP** is in **NP**.
- Is **MCSP** **NP-complete**? **Not known!**

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- Is **MCSP** **NP-complete**? **Not known!**
- **Multi-output MCSP** is **NP-hard** under poly-time randomized reductions. (*Ilango, Loff, Oliveira 2020*)

A peculiar NP problem

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- Easy to see that **MCSP** is in **NP**.
- Is **MCSP** **NP-complete**? **Not known!**
- **Partial fn. MCSP** is **NP-hard** under poly-time randomized reductions. (*Hirahara 2022*)

More NP-complete problems

Example 1: Independent Set

- **INDSET** := $\{(G, k) : G \text{ has independent set of size } k\}$

- **Goal:** Design a poly-time reduction **f** s.t.

$$x \in 3SAT \iff f(x) \in \text{INDSET}$$

- **Reduction from 3SAT:** Recall, a reduction is just an efficient algorithm that takes input a 3CNF ϕ and outputs a (G, k) tuple s.t

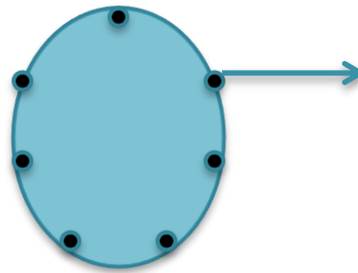
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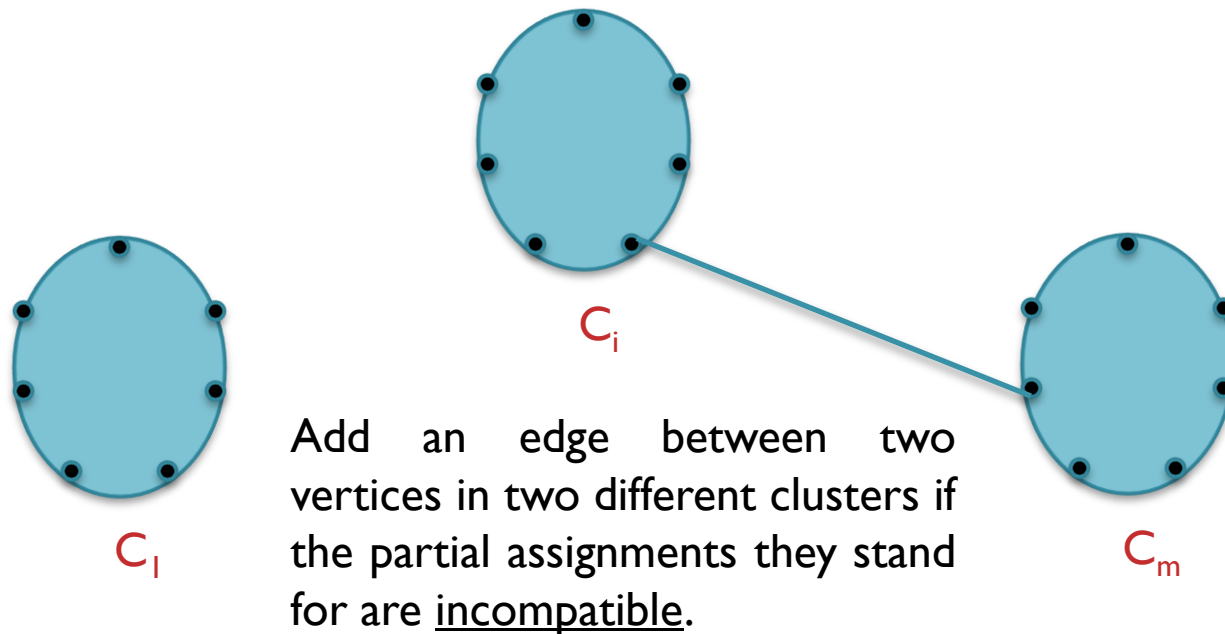


A vertex stands for a partial assignment of the variables in C_i that satisfies the clause

For every clause C_i form a complete graph (cluster) on 7 vertices

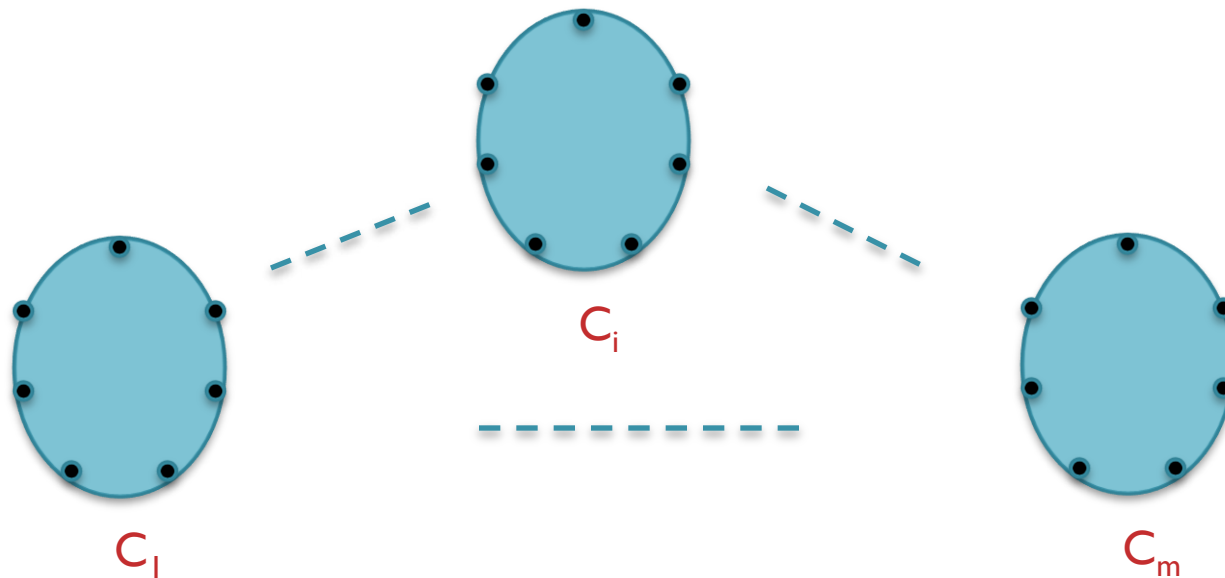
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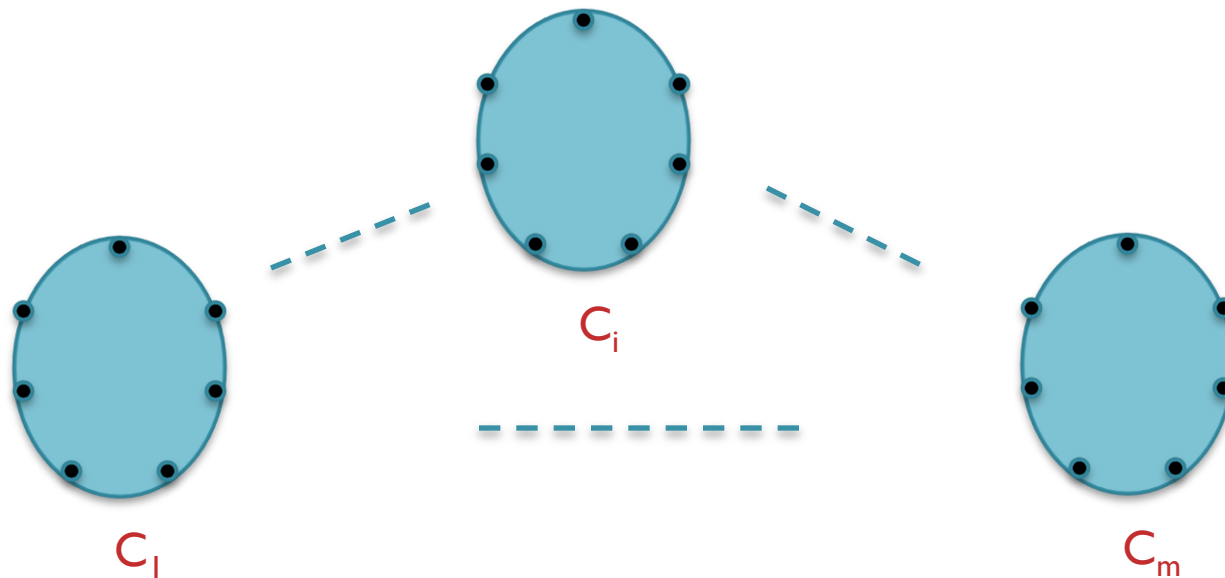
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Graph G on $7m$ vertices

Example 1: Independent Set

- **Reduction:** Let ϕ be a 3CNF with m clauses and n variables. Assume, every clause has exactly 3 literals.



- **Obs:** ϕ is satisfiable iff G has an ind. set of size m .

Example 2: Clique

- **CLIQUE** := $\{(H, k): H \text{ has a clique of size } k\}$

- **Goal:** Design a poly-time reduction **f** s.t.

$$x \in \text{INDSET} \iff f(x) \in \text{CLIQUE}$$

- **Reduction from INDSET:** The reduction algorithm computes $\bar{G}$ from G

$$(G, k) \in \text{INDSET} \iff (\bar{G}, k) \in \text{CLIQUE}$$

Example 3: Vertex Cover

- $\text{VCover} := \{(H, k): H \text{ has a vertex cover of size } k\}$
- **Goal:** Design a poly-time reduction f s.t.

$$x \in \text{INDSET} \iff f(x) \in \text{VCover}$$

- **Reduction from INDSET:** Let n be the number of vertices in G . The reduction algorithm maps (G, k) to $(G, n-k)$.

$$(G, k) \in \text{INDSET} \iff (G, n-k) \in \text{VCover}$$

Example 4: 0/1 Integer Programming

- **0/1 IProg** := Set of satisfiable 0/1 integer programs
- A 0/1 integer program is a set of linear inequalities with rational coefficients and the variables are allowed to take only 0/1 values.
- **Reduction from 3SAT:** A clause is mapped to a linear inequality as follows

$$x_1 \vee \bar{x}_2 \vee x_3 \quad \longrightarrow \quad x_1 + (1 - x_2) + x_3 \geq 1$$

Example 5: Max Cut

- **MaxCut** : Given a graph find a cut with the max size.
- A cut of $G = (V, E)$ is a tuple $(U, V \setminus U)$, $U \subseteq V$. Size of a cut $(U, V \setminus U)$ is the number of edges from U to $V \setminus U$.
- **MinVCover**: Given a graph H , find a vertex cover in H that has the min size.
- **Obs**: From **MinVCover**(H), we can readily check if $(H, k) \in \text{VCover}$, for any k .

Example 5: Max Cut

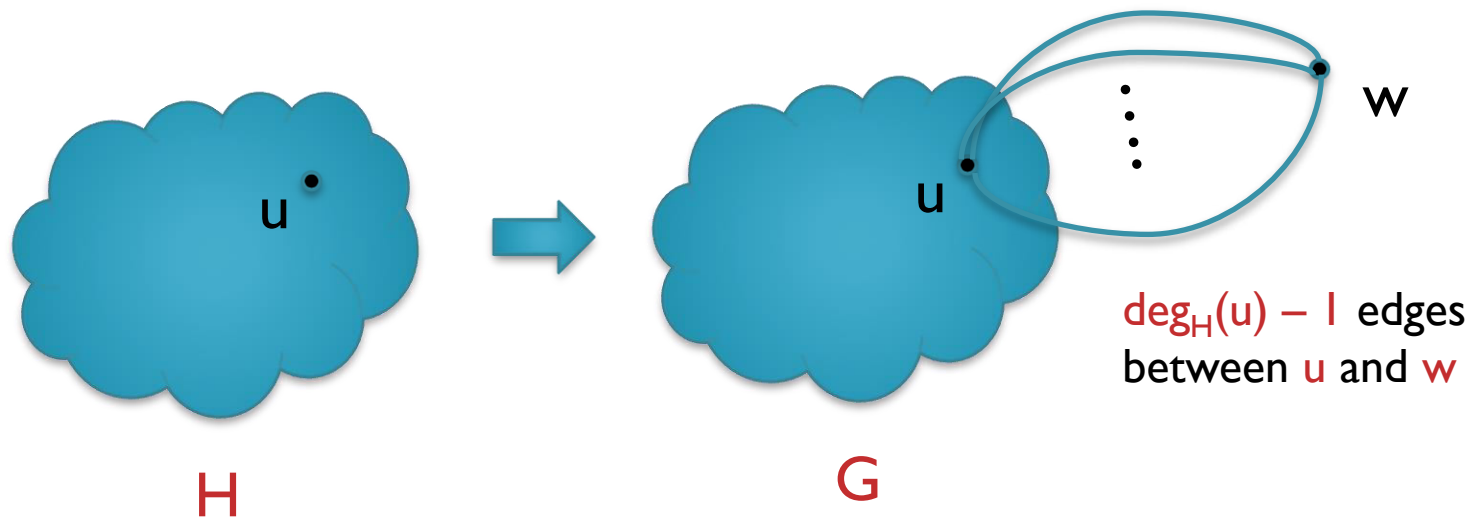
- **MaxCut** : Given a graph find a cut with the max size.
- A *cut* of $G = (V, E)$ is a tuple $(U, V \setminus U)$, $U \subseteq V$. Size of a cut $(U, V \setminus U)$ is the number of edges from U to $V \setminus U$.
- **Goal**: A poly-time reduction from **MinVCover** to **MaxCut**.



$$\text{Size of a MaxCut}(G) = 2 \cdot |E(H)| - |\text{MinVCover}(H)|$$

Example 5: Max Cut

- The reduction: $H \xrightarrow{f} G$



- G is formed by adding a new vertex w and adding $\deg_H(u) - 1$ edges between every $u \in V(H)$ and w .

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Suppose $(U, V \setminus U + w)$ is a cut in G .

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- Let $S_G(U) :=$ no. of edges in G with exactly one end vertex incident on a vertex in U .

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Suppose $(U, V \setminus U + w)$ is a cut in G .

- Then $S_G(U) = S_H(U) + \sum_{u \in U} (\deg_H(u) - 1)$

$$= S_H(U) + \sum_{u \in U} \deg_H(u) - |U|$$

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Obs: Twice the number of edges in H with at least one end vertex in U .

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$$= 2 \cdot |E_H(U)| - |U|$$

$E_H(U) :=$ Set of edges in H with at least one end vertex in U .

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Suppose $(U, V \setminus U + w)$ is a cut in G .

- Then $S_G(U) = 2 \cdot |E_H(U)| - |U| \quad \dots \text{Eqn (I)}$
- **Proposition:** If $(U, V \setminus U + w)$ is a max cut in G then U is a vertex cover in H .

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- **Proposition:** If $(U, V \setminus U + w)$ is a max cut in G then U is a vertex cover in H .
 U must be a minVCover in H

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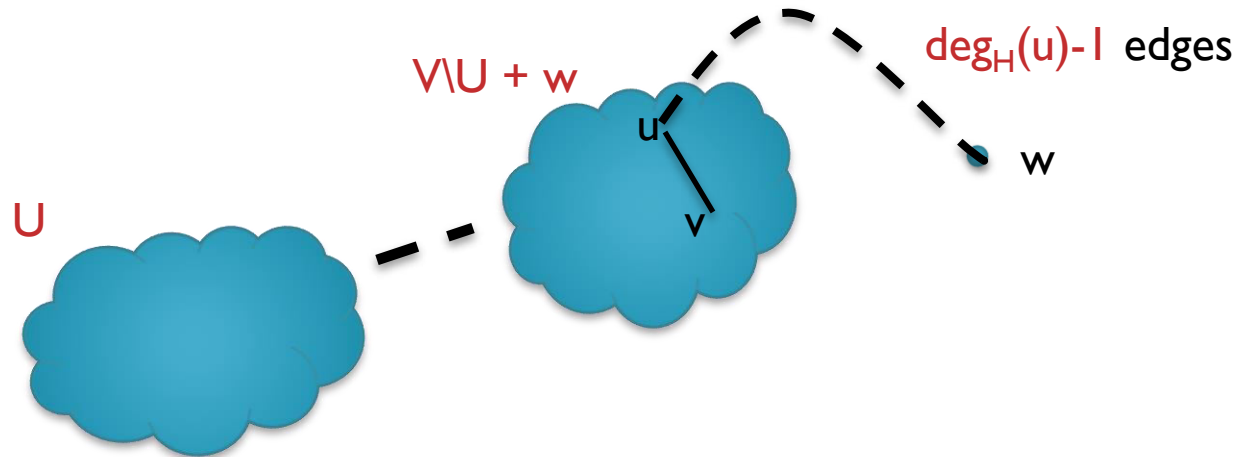
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Thus, the proof of the above claim follows from the proposition

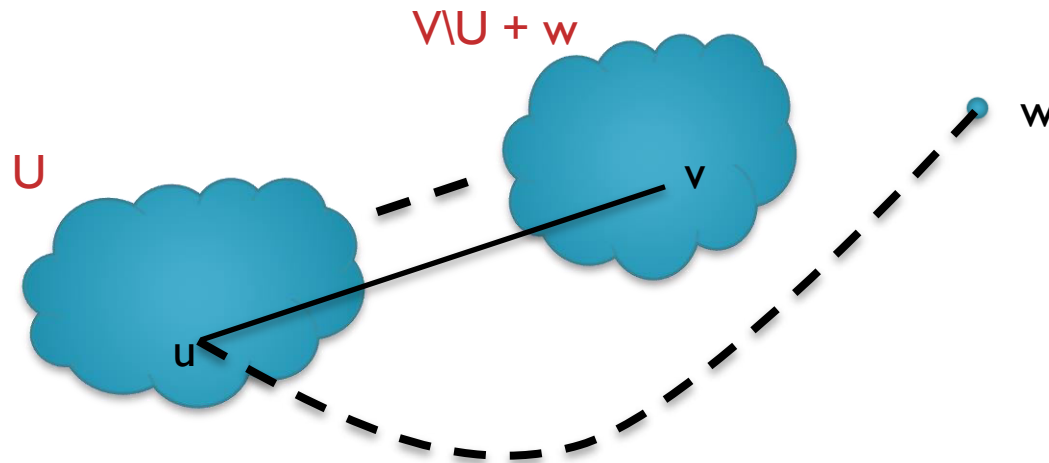
Example 5: Max Cut

- **Proof of the Proposition:** Suppose U is not a vertex cover



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- **Proof of the Proposition:** Suppose U is not a vertex cover



Gain: $\deg_H(u) - 1 + 1$ edges.

Loss: At most $\deg_H(u) - 1$ edges, these are the edges going from U to u .

Net gain: At least 1 edge. Hence the cut is not a max cut.