COMPLEXITY THEORY

Lecture 7: NP Completeness

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Knowledge-Based Systems

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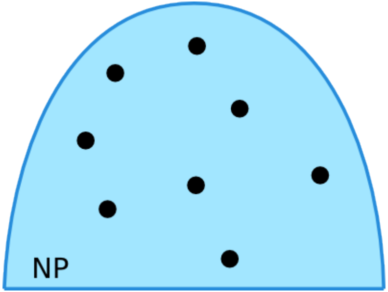
Review

Are NP Problems Hard?

The Structure of NP

Idea: polynomial many-one reductions define an order on problems



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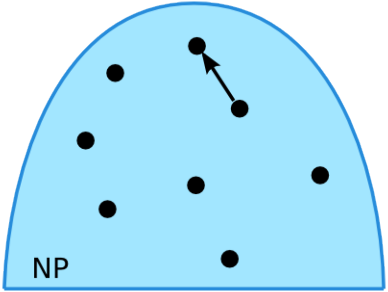

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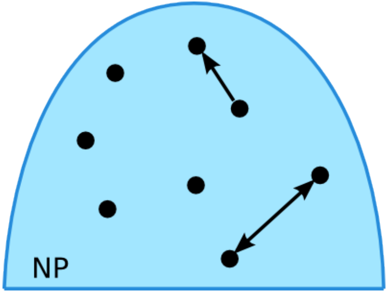

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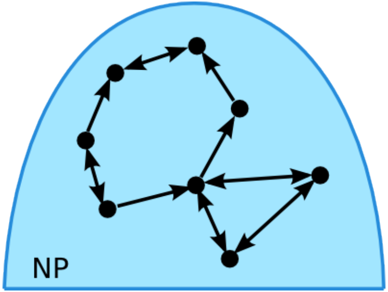

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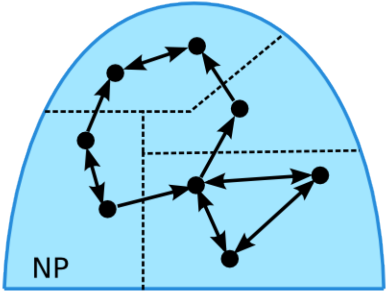

NP-Hardness and NP-Completeness

Definition 7.1:

(1) A language $\mathbf{H}$ is NP-hard, if $\mathbf{L} \leq_p \mathbf{H}$ for every language $\mathbf{L} \in \text{NP}$.

(2) A language $\mathbf{C}$ is NP-complete, if $\mathbf{C}$ is NP-hard and $\mathbf{C} \in \text{NP}$.

NP-Completeness

- NP-complete problems are the hardest problems in NP.
- They constitute the maximal class (wrt. $\leq_p$) of problems within NP.
- They are all equally difficult – an efficient solution to one would solve them all.

Theorem 7.2: If $\mathbf{L}$ is NP-hard and $\mathbf{L} \leq_p \mathbf{L}'$, then $\mathbf{L}'$ is NP-hard as well.

Proving NP-Completeness

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How to show NP-completeness

To show that **L** is NP-complete, we must show that every language in NP can be reduced to **L** in polynomial time.

Alternative approach

Given an NP-complete language **C**, we can show that another language **L** is NP-complete just by showing that

- $\mathbf{C} \leq_p \mathbf{L}$
- $\mathbf{L} \in \mathrm{NP}$

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- **L** $\in$ NP

However: Is there any NP-complete problem at all?

The First NP-Complete Problems

Is there any NP-complete problem at all?

Of course there is: the word problem for polynomial time NTMs!

POLYTIME NTM

Input: A polynomial p, a p-time bounded NTM $\mathcal{M}$, and an input word w.

Problem: Does $\mathcal{M}$ accept w (in time $p(|w|)$)?

The First NP-Complete Problems

Is there any NP-complete problem at all?

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Polytime NTM

Input:	A polynomial p, a p-time bounded NTM $\mathcal{M}$, and an input word w.
Problem:	Does $\mathcal{M}$ accept w (in time $p(\|w\|)$)?

Theorem 7.3: Polytime NTM is NP-complete.

Proof: See exercise.

Further NP-Complete Problem?

Polytime NTM is NP-complete, but not very interesting:

- not most convenient to work with
- not of much interest outside of complexity theory

Are there more natural NP-complete problems?

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Are there more natural NP-complete problems?

Yes, thousands of them!

The Cook-Levin Theorem

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Proof:

(1) **Sat** $\in$ NP

Take satisfying assignments as polynomial certificates for the satisfiability of a formula.

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Proof:

(1) SAT $\in$ NP

Take satisfying assignments as polynomial certificates for the satisfiability of a formula.

(2) SAT is hard for NP

Proof by reduction from the word problem for NTMs.

$\square$

Proving the Cook-Levin Theorem

Given:

- a polynomial p
- a p-time bounded 1-tape NTM $\mathcal{M} = (Q, \Sigma, \Gamma, \delta, q_0, q_{\text{accept}})$
- a word w

Intended reduction

Define a propositional logic formula $\varphi_{p,\mathcal{M},w}$ such that
$\varphi_{p,\mathcal{M},w}$ is satisfiable if and only if $\mathcal{M}$ accepts w in time $p(|w|)$.

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Note

On input w of length $n := |w|$, every computation path of $\mathcal{M}$ is of length $\leq p(n)$ and uses $\leq p(n)$ tape cells.

Idea

Use logic to describe a run of $\mathcal{M}$ on input w by a formula.

Proving Cook-Levin: Encoding Configurations

Use propositional variables for describing configurations:

Q_q for each $q \in Q$ means "$\mathcal{M}$ is in state $q \in Q$"

P_i for each $0 \leq i < p(n)$ means "the head is at Position i"

$S_{a,i}$ for each $a \in \Gamma$ and $0 \leq i < p(n)$ means "tape cell i contains Symbol a"

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Represent configuration $(q, p, a_0 \ldots a_{p(n)})$

by assigning truth values to variables from the set

$$\overline{C} := \{Q_q, P_i, S_{a,i} \mid q \in Q, \quad a \in \Gamma, \quad 0 \leq i < p(n)\}$$

using the truth assignment β defined as

$$\beta(Q_s) := \begin{cases} 1 & s = q \\ 0 & s \neq q \end{cases} \qquad \beta(P_i) := \begin{cases} 1 & i = p \\ 0 & i \neq p \end{cases} \qquad \beta(S_{a,i}) := \begin{cases} 1 & a = a_i \\ 0 & a \neq a_i \end{cases}$$

Proving Cook-Levin: Validating Configurations

We define a formula Conf($\overline{C}$) for a set of configuration variables

$$\overline{C} = \{Q_q, P_i, S_{a,i} \mid q \in Q, \quad a \in \Gamma, \quad 0 \leq i < p(n)\}$$

as follows:

Conf($\overline{C}$) :=	"the assignment is a valid configuration":
$\bigvee_{q \in Q} \left(Q_q \wedge \bigwedge_{q' \neq q} \neg Q_{q'}\right)$	"TM in exactly one state $q \in Q$"
$\wedge \bigvee_{p < p(n)} \left(P_p \wedge \bigwedge_{p' \neq p} \neg P_{p'}\right)$	"head in exactly one position $p \leq p(n)$"
$\wedge \bigwedge_{0 \leq i < p(n)} \bigvee_{a \in \Gamma} \left(S_{a,i} \wedge \bigwedge_{b \neq a \in \Gamma} \neg S_{b,i}\right)$	"exactly one $a \in \Gamma$ in each cell"

Proving Cook-Levin: Validating Configurations

For an assignment β defined on variables in $\overline{C}$ define

$$\mathrm{conf}(\overline{C},\beta) := \left\{ (q,p,w_0\ldots w_{p(n)}) \;\middle|\; \begin{array}{l} \beta(Q_q) = 1, \\ \beta(P_p) = 1, \\ \beta(S_{w_i,i}) = 1 \text{ for all } 0 \leq i < p(n) \end{array} \right\}$$

Note: β may be defined on other variables besides those in $\overline{C}$.

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Lemma 7.5: If β satisfies $\mathsf{Conf}(\overline{C})$ then $|\mathsf{conf}(\overline{C},\beta)| = 1$.
We can therefore write $\mathsf{conf}(\overline{C},\beta) = (q,p,w)$ to simplify notation.

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Observations:

- $\mathsf{conf}(\overline{C},\beta)$ is a potential configuration of $\mathcal{M}$, but it may not be reachable from the start configuration of $\mathcal{M}$ on input w.
- Conversely, every configuration $(q,p,w_1\dots w_{p(n)})$ induces a satisfying assignment β or which $\mathsf{conf}(\overline{C},\beta) = (q,p,w_1\dots w_{p(n)})$.

Proving Cook-Levin: Transitions Between Configurations

Consider the following formula $\mathsf{Next}(\overline{C}, \overline{C}')$ defined as

$$\mathsf{Conf}(\overline{C}) \wedge \mathsf{Conf}(\overline{C}') \wedge \mathsf{NoChange}(\overline{C}, \overline{C}') \wedge \mathsf{Change}(\overline{C}, \overline{C}').$$

$$\mathsf{NoChange} := \bigvee_{0 \leq p < p(n)} \Big(P_p \wedge \bigwedge_{i \neq p, a \in \Gamma} (S_{a,i} \to S'_{a,i}) \Big)$$

$$\mathsf{Change} := \bigvee_{0 \leq p < p(n)} \Big(P_p \wedge \bigvee_{\substack{q \in Q \\ a \in \Gamma}} (Q_q \wedge S_{a,p} \wedge \bigvee_{(q',b,D) \in \delta(q,a)} (Q'_{q'} \wedge S'_{b,p} \wedge P'_{D(p)})) \Big)$$

where $D(p)$ is the position reached by moving in direction D from p.

Proving Cook-Levin: Transitions Between Configurations

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where $D(p)$ is the position reached by moving in direction D from p.

Lemma 7.6: For any assignment β defined on $\overline{C} \cup \overline{C}'$:

β satisfies $\mathsf{Next}(\overline{C}, \overline{C}')$ if and only if $\mathsf{conf}(\overline{C}, \beta) \vdash_{\mathcal{M}} \mathsf{conf}(\overline{C}', \beta)$

Proving Cook-Levin: Start and End

Defined so far:

- Conf($\overline{C}$): $\overline{C}$ describes a potential configuration
- Next($\overline{C}, \overline{C}'$): conf($\overline{C}, \beta$) $\vdash_{\mathcal{M}}$ conf($\overline{C}', \beta$)

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Start configuration:

For an input word $w = w_0 \cdots w_{n-1} \in \Sigma^*$, we define:

$$\mathsf{Start}_{\mathcal{M},w}(\overline{C}) := \mathsf{Conf}(\overline{C}) \wedge Q_{q_0} \wedge P_0 \wedge \bigwedge_{i=0}^{n-1} S_{w_i,i} \wedge \bigwedge_{i=n}^{p(n)-1} S_{\llcorner\!\lrcorner,i}$$

Then an assignment β satisfies $\mathsf{Start}_{\mathcal{M},w}(\overline{C})$ if and only if $\overline{C}$ represents the start configuration of $\mathcal{M}$ on input w.

Proving Cook-Levin: Start and End

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Then an assignment β satisfies Start$_{\mathcal{M},w}(\overline{C})$ if and only if $\overline{C}$ represents the start configuration of $\mathcal{M}$ on input w.

Accepting stop configuration:

$$\text{Acc-Conf}(\overline{C}) := \text{Conf}(\overline{C}) \wedge Q_{q_{\text{accept}}}$$

Then an assignment β satisfies Acc-Conf($\overline{C}$) if and only if $\overline{C}$ represents an accepting configuration of $\mathcal{M}$.

Proving Cook-Levin: Adding Time

Since $\mathcal{M}$ is p-time bounded, each run may contain up to $p(n)$ steps
$\leadsto$ we need one set of configuration variables for each

Propositional variables

$Q_{q,t}$ for all $q \in Q$, $0 \leq t \leq p(n)$ means "at time t, $\mathcal{M}$ is in state $q \in Q$"

$P_{i,t}$ for all $0 \leq i, t \leq p(n)$ means "at time t, the head is at position i"

$S_{a,i,t}$ for all $a \in \Gamma$ and $0 \leq i, t \leq p(n)$ means "at time t, tape cell i contains symbol a"

Notation

$$\overline{C}_t := \{Q_{q,t},\ P_{i,t},\ S_{a,i,t} \mid \quad q \in Q, 0 \leq i \leq p(n), \quad a \in \Gamma\}$$

Proving Cook-Levin: The Formula

Given:

- a polynomial p
- a p-time bounded 1-tape NTM $\mathcal{M} = (Q, \Sigma, \Gamma, \delta, q_0, q_{\text{accept}})$
- a word w

We define the formula $\varphi_{p,\mathcal{M},w}$ as follows:

$$\varphi_{p,\mathcal{M},w} := \text{Start}_{\mathcal{M},w}(\overline{C}_0) \wedge \bigvee_{0\leq t\leq p(n)} \left(\text{Acc-Conf}(\overline{C}_t) \wedge \bigwedge_{0\leq i<t} \text{Next}(\overline{C}_i, \overline{C}_{i+1}) \right)$$

"C_0 encodes the start configuration" and for some polynomial time t:
"$\mathcal{M}$ accepts after t steps" and "$\overline{C}_0, \ldots, \overline{C}_t$ encode a computation path"

> **Lemma 7.7:** $\varphi_{p,\mathcal{M},w}$ is satisfiable if and only if $\mathcal{M}$ accepts w in time $p(|w|)$.

Note that an accepting or rejecting stop configuration has no successor.

Theorem 7.4 (Cook 1970, Levin 1973): SAT is NP-complete.

Proof:

(1) SAT $\in$ NP

Take satisfying assignments as polynomial certificates for the satisfiability of a formula.

(2) SAT is hard for NP

Proof by reduction from the word problem for NTMs.

$\square$

Further NP-complete Problems

Towards More NP-Complete Problems

Starting with **Sat**, one can readily show more problems **P** to be NP-complete, each time performing two steps:

(1) Show that **P** $\in$ NP

(2) Find a known NP-complete problem **P′** and reduce **P′** $\leq_p$ **P**

Thousands of problem have now been shown to be NP-complete.
(See Garey and Johnson for an early survey)

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In this course:

	$\leq_p$	**Clique**	$\leq_p$	**Independent Set**
Sat	$\leq_p$	**3-Sat**	$\leq_p$	**Dir. Hamiltonian Path**
	$\leq_p$	**Subset Sum**	$\leq_p$	**Knapsack**

NP-Completeness of **Clique**

Theorem 7.8: Clique is NP-complete.

Clique: Given G, k, does G contain a clique of order $\geq k$?

Proof:

(1) **Clique** $\in$ NP

Take the vertex set of a clique of order k as a certificate.

(2) **Clique** is NP-hard

We show **Sat** $\leq_p$ **Clique**

To every CNF-formula φ assign a graph G_φ and a number k_φ such that

$$\varphi \text{ satisfiable} \quad \Longleftrightarrow \quad G_\varphi \text{ contains clique of order } k_\varphi$$

SAT $\leq_p$ CLIQUE

To every CNF-formula φ assign a graph G_φ and a number k_φ such that

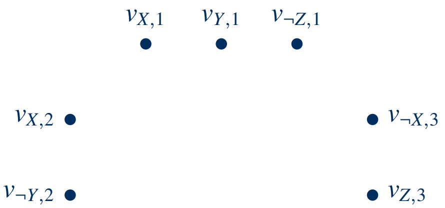
φ satisfiable if and only if G_φ contains clique of order k_φ

Given $\varphi = C_1 \land \cdots \land C_k$:

- Set $k_\varphi := k$
- For each clause C_j and literal $L \in C_j$ add a vertex $v_{L,j}$
- Add edge $\{v_{L,j}, v_{K,i}\}$ if $i \neq j$ and $L \land K$ is satisfiable (that is: if $L \neq \neg K$ and $\neg L \neq K$)

Example 7.9:

$$\underbrace{(X \lor Y \lor \neg Z)}_{C_1} \land \underbrace{(X \lor \neg Y)}_{C_2} \land \underbrace{(\neg X \lor Z)}_{C_3}$$



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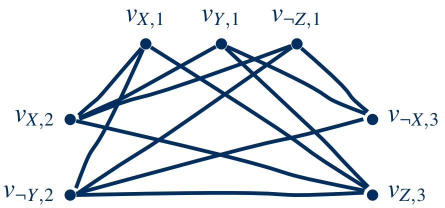

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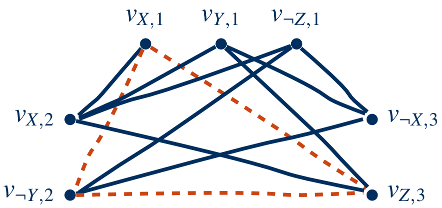

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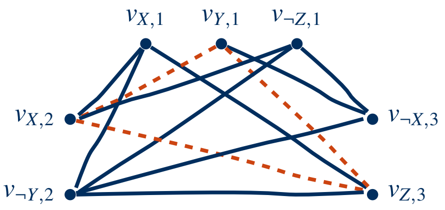

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  (that is: if $L \neq \neg K$ and $\neg L \neq K$)

Correctness:

G_φ has clique of order k iff φ is satisfiable.

Complexity:

The reduction is clearly computable in polynomial time.

NP-Completeness of INDEPENDENT SET

INDEPENDENT SET

Input:	An undirected graph G and a natural number k
Problem:	Does G contain k vertices that share no edges (independent set)?

Theorem 7.10: **INDEPENDENT SET** is NP-complete.

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Theorem 7.10: INDEPENDENT SET is NP-complete.

Proof: Hardness by reduction **CLIQUE** $\leq_p$ **INDEPENDENT SET**:

- Given $G := (V, E)$ construct $\overline{G} := (V, \{\{u, v\} \mid \{u, v\} \notin E$ and $u \neq v\})$

NP-Completeness of Independent Set

Independent Set

Input: An undirected graph G and a natural number k

Problem: Does G contain k vertices that share no edges (independent set)?

Theorem 7.10: **Independent Set** is NP-complete.

Proof: Hardness by reduction **Clique** $\leq_p$ **Independent Set**:

- Given $G := (V, E)$ construct $\overline{G} := (V, \{\{u, v\} \mid \{u, v\} \notin E \text{ and } u \neq v\})$
- A set $X \subseteq V$ induces a clique in G iff X induces an independent set in $\overline{G}$.
- Reduction: G has a clique of order k iff $\overline{G}$ has an independent set of order k.

$\square$

Summary and Outlook

NP-complete problems are the hardest in NP

Polynomial runs of NTMs can be described in propositional logic (Cook-Levin)

Clique and **Independent Set** are also NP-complete

What's next?

- More examples of problems
- The limits of NP
- Space complexities