Theory of Computation
Poly-time reductions, NP-completeness

The million dollar question

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- Can you write an *efficient* algorithm to answer this question?
- **Can you prove that no efficient algorithm exists for this problem?**

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- **Def:** a computable function f is **poly-time computable** if M runs in polynomial time

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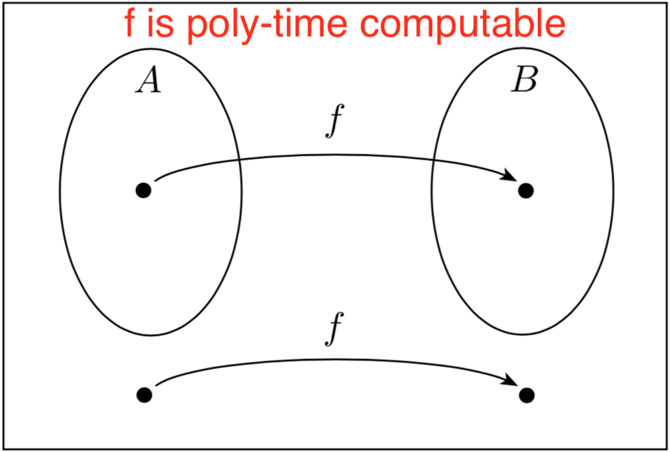
- **Def:** We say A is **poly-time reducible** to B (denoted $A \leq_{\text{poly}} B$) if the reduction f is poly-time computable
- Informally, it means that we can "convert" an instance of A to an instance of B in polynomial time

Poly-time reductions



Implications of poly-time reducibility

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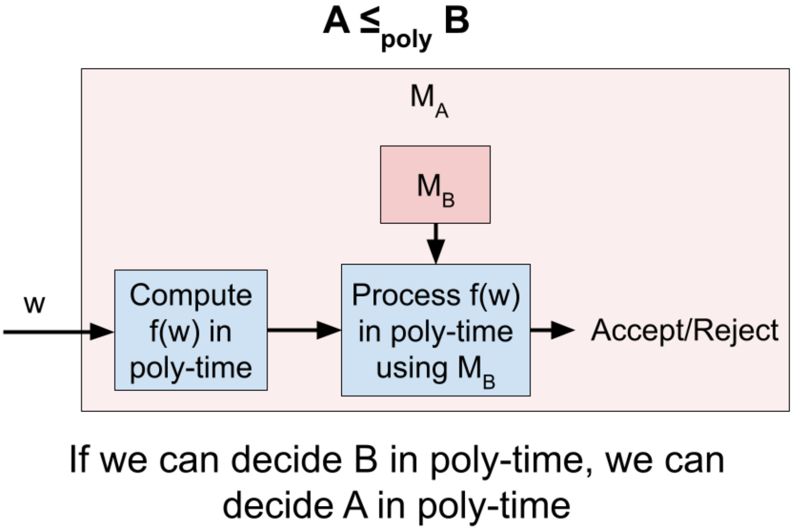
    1. Compute $f(w)$ (poly-time)
    2. Run M_B on $f(w)$ (poly-time)
    3. If M_B accepts $f(w)$ then M_A accepts w. Otherwise, M_A rejects w.

Implications of polytime-reducibility



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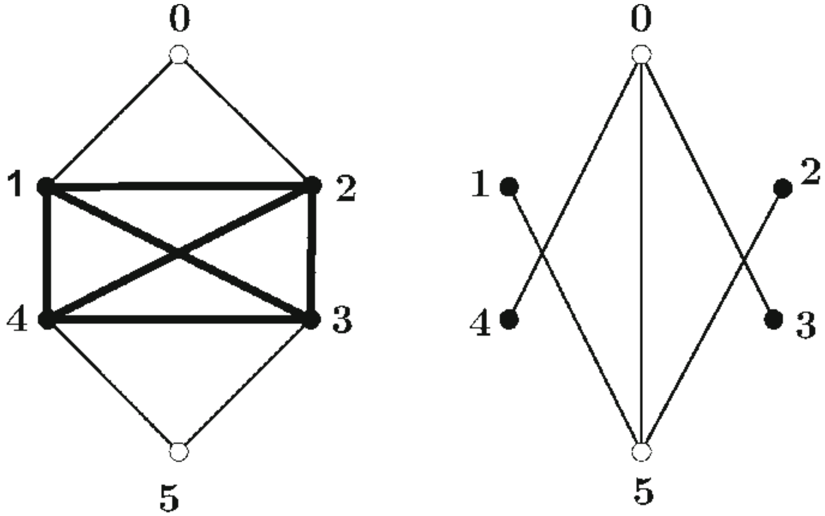

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Poly-time: $O(E)$ to construct $\overline{G}$

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"YES maps to YES": If G has a k-independent set, then those same vertices will all be connected in $\overline{G}$

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"NO maps to NO": If G doesn't have a k-independent set, then every set of k vertices has at least one edge. Those same vertices will be missing an edge in $\overline{G}$

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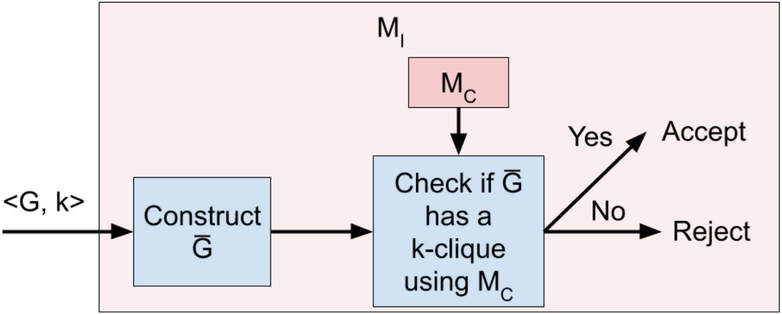

If we can decide CLIQUE in poly-time,
we can decide IND-SET in poly-time

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We reduce from IND-SET to CLIQUE as follows:

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2. Create a graph G
3. For each clause $(x \vee y \vee z)$, create three nodes x, y, z and connect them to form a "triangle"

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4. If there are nodes x and $\neg x$, connect them with an edge
5. Check if there is an independent set of size m

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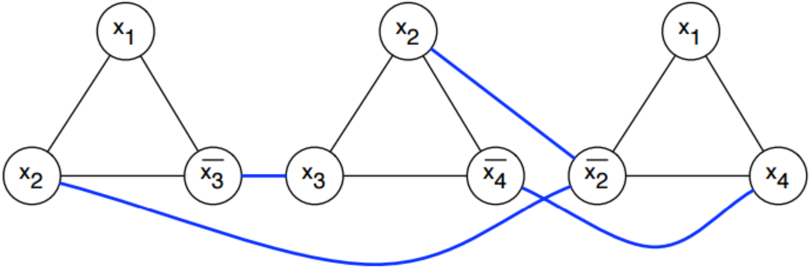
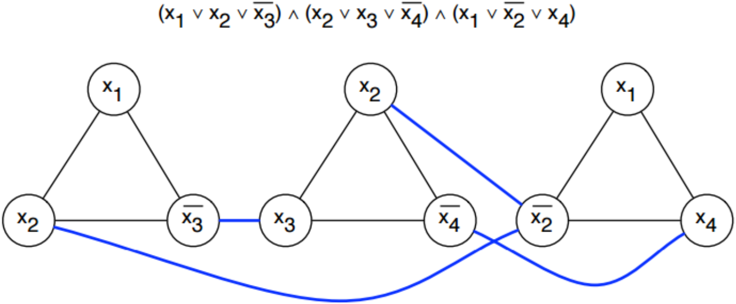
We reduce from IND-SET to CLIQUE as follows:

$$(x_1 \vee x_2 \vee \overline{x_3}) \wedge (x_2 \vee x_3 \vee \overline{x_4}) \wedge (x_1 \vee \overline{x_2} \vee x_4)$$



3-SAT $\leq_{\text{poly}}$ IND-SET: poly-time



- $O(m)$ vertices

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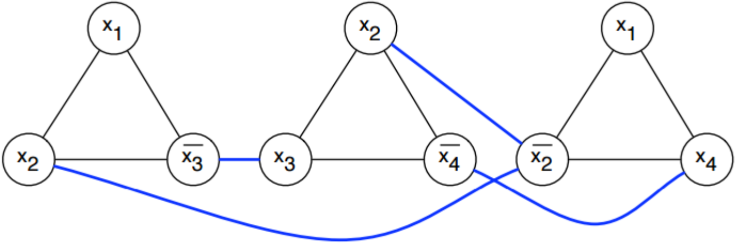

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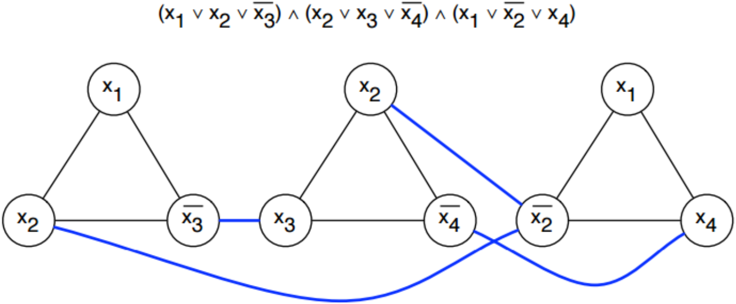

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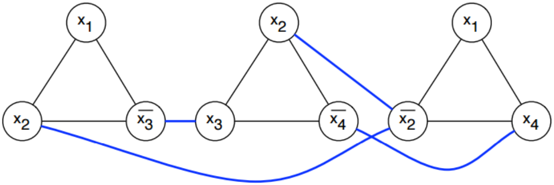

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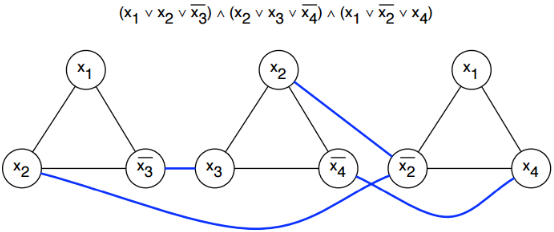

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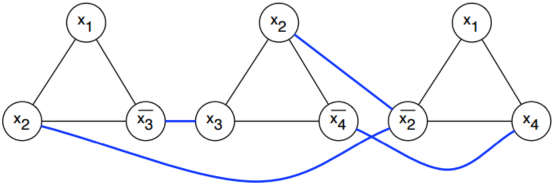

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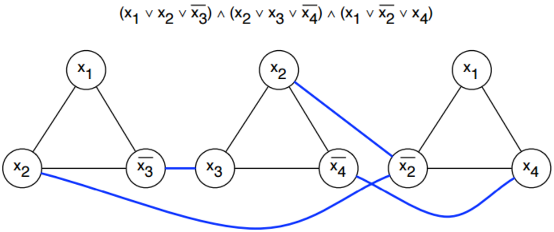

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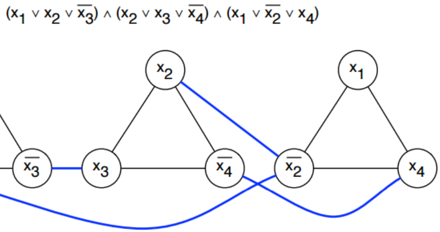

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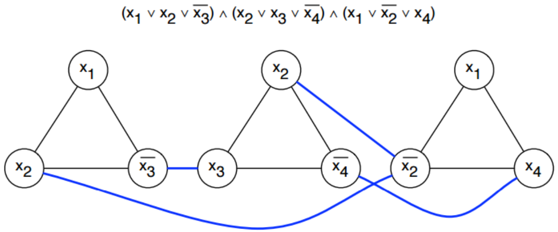

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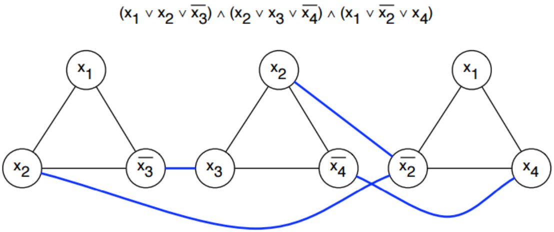

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- m clauses $\rightarrow$ m triangles $\rightarrow$ m-independent set

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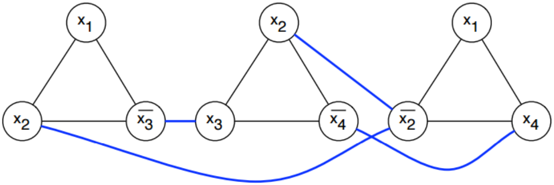

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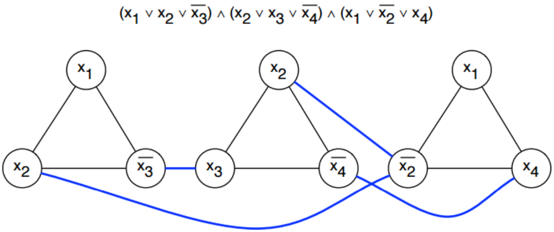

Show the contrapositive: yes $\leftarrow$ yes

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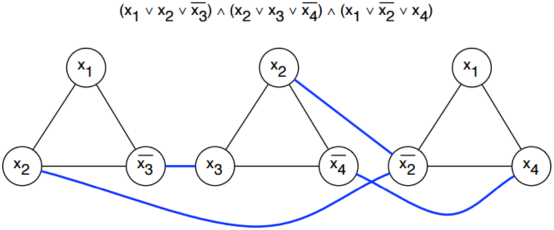

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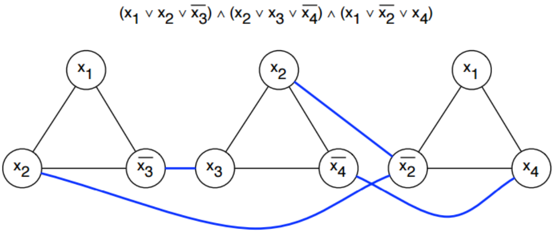

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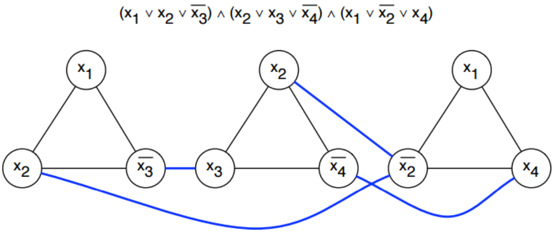

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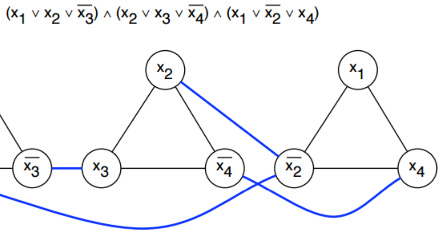

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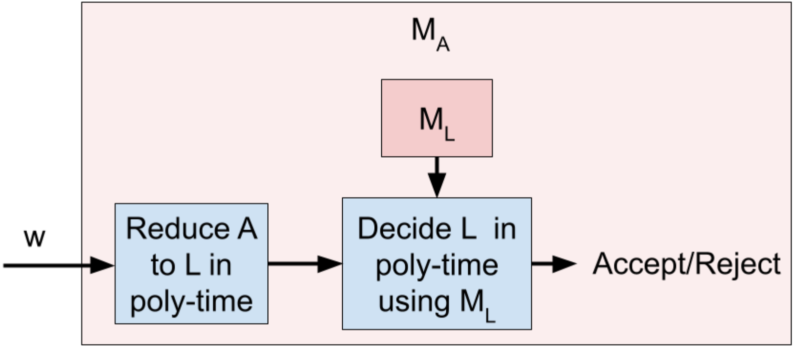
- **Def:** L is NP-complete if:
  1. $L \in \mathrm{NP}$
  2. L is NP-Hard
- L is the "hardest" or "most expressive" problem in NP

NP-completeness

L is NP-Hard

$A \in NP$



If we can decide L in poly-time, we can decide *every* NP language in poly-time!

3-SAT is NP-complete

$\mathrm{3\text{-}SAT}$ is NP-complete

Cook-Levin theorem: $\mathrm{CIRCUIT-SAT}$ is NP-complete

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See Sipser for full proof

3-SAT is NP-complete

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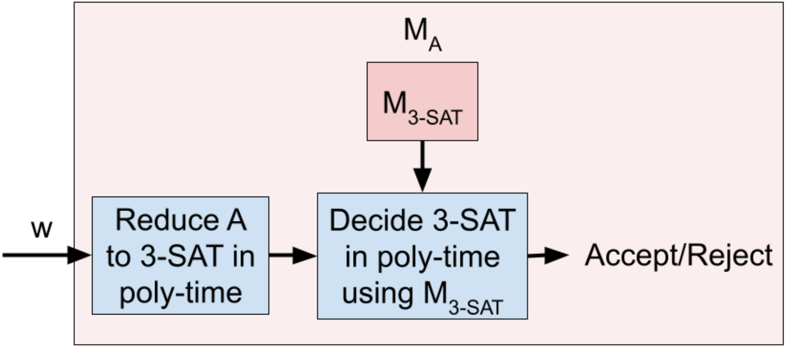
A ∈ NP



If we can decide 3-SAT in poly-time, we can decide *every* NP language in poly-time!

Transitivity of $\leq_{\text{poly}}$

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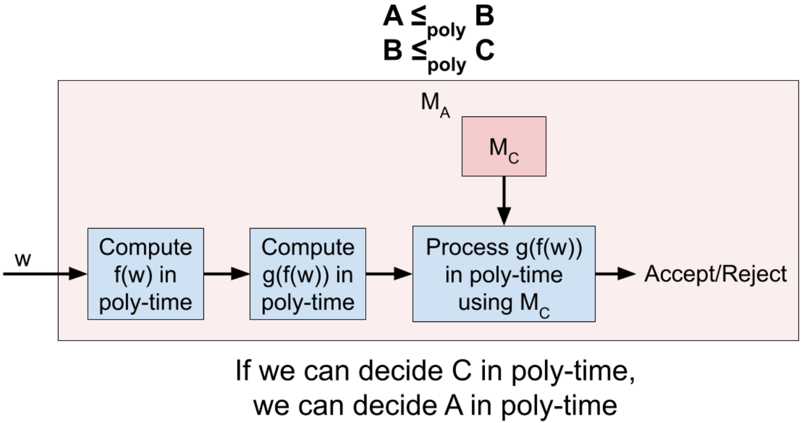
- There exists a poly-time computable function g such that $w \in B \Leftrightarrow g(w) \in C$
- $w \in A \Leftrightarrow f(w) \in B \Leftrightarrow g(f(w)) \in C$

Transitivity of $\leq_{\text{poly}}$

Proposition: If $A \leq_{\text{poly}} B$ and $B \leq_{\text{poly}} C$, then $A \leq_{\text{poly}} C$

- There exists a poly-time computable function f such that $w \in A \Leftrightarrow f(w) \in B$
- There exists a poly-time computable function g such that $w \in B \Leftrightarrow g(w) \in C$
- $w \in A \Leftrightarrow f(w) \in B \Leftrightarrow g(f(w)) \in C$
- $g \circ f$ is a poly-time reduction from A to C!

Transitivity of $\leq_{\text{poly}}$



Transitivity of NP-Completeness

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Corollary: If A is NP-complete, and $A \leq_{\mathrm{poly}} B$, then B is NP-complete

Transitivity of NP-Completeness

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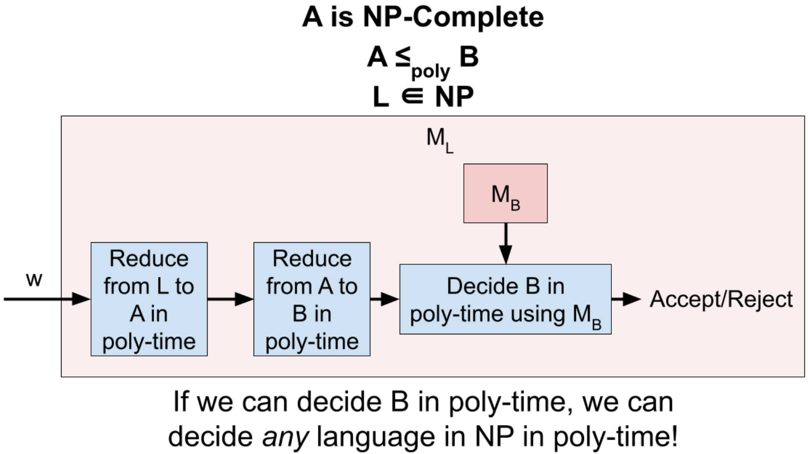

Implications of 3-SAT NP-Completeness

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Implications of 3-SAT NP-Completeness

- **We can use 3-SAT to prove that other languages are NP-complete!**
  - If we can show that 3-SAT $\leq_{\text{poly}} L$, it follows that L is also complete!
- And we can use those other languages to show that even more languages are NP-complete

Implications of 3-SAT NP-Completeness

IND-SET is NP-Complete

$\mathrm{IND\text{-}SET}$ is NP-Complete

- $3\text{-}\mathrm{SAT}$ is known to be NP-complete

$\mathrm{IND\text{-}SET}$ is NP-Complete

- $\mathrm{3\text{-}SAT}$ is known to be NP-complete
- We proved that $\mathrm{3\text{-}SAT} \leq_{\mathrm{poly}} \mathrm{IND\text{-}SET}$

IND-SET is NP-Complete

- 3-SAT is known to be NP-complete
- We proved that 3-SAT $\leq_{\text{poly}}$ IND-SET
- Thus, IND-SET is NP-complete

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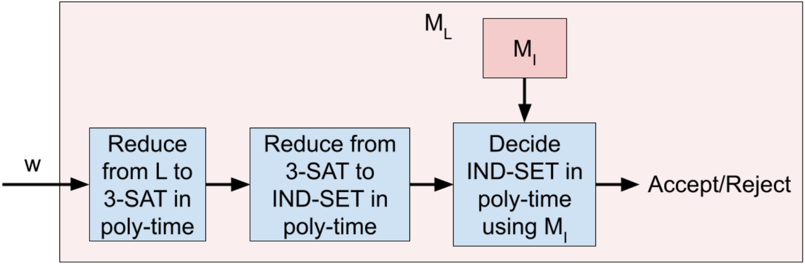
3-SAT is NP-Complete

3-SAT $\leq_{poly}$ IND-SET

L $\in$ NP



If we can decide IND-SET in poly-time, we can decide *any* language in NP in poly-time!

CLIQUE is NP-Complete

CLIQUE is NP-Complete

- IND-SET is known to be NP-Complete

CLIQUE is NP-Complete

- IND-SET is known to be NP-Complete
- We proved that IND-SET $\leq_{\text{poly}}$ CLIQUE

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CLIQUE is NP-Complete

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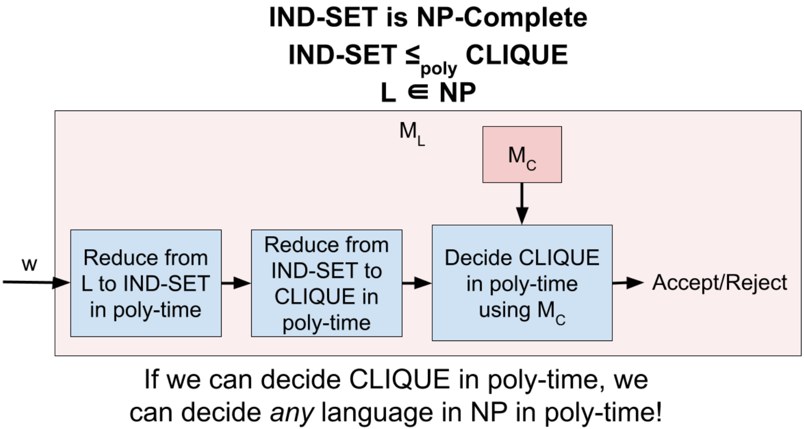
- We proved that IND-SET $\leq_{\text{poly}}$ CLIQUE
- Thus, CLIQUE is NP-Complete



SUBSET-SUM is NP-Complete

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Proof: Reduce from 3-SAT

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   - The digits of the number correspond to which clauses that variable can satisfy
2. We will set the target sum such that it can only be reached through a satisfying assignment
   - To reach the target, each clause needs to have at least of its true
3. We will set the desired sum such that each clause needs to satisfied

3-SAT $\leq_{\text{poly}}$ SUBSET-SUM: variables

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- We want our numbers to correspond to assigning each variable to TRUE or FALSE

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3-SAT $\leq_{\text{poly}}$ SUBSET-SUM: variables

- We want our numbers to correspond to assigning each variable to TRUE or FALSE
- For each variable x_i, we will create two numbers: x_i^{TRUE} and x_i^{FALSE}
- We will design our desired total so that exactly one of these two numbers must be picked

3-SAT $\leq_{\text{poly}}$ SUBSET-SUM: variables

$$F = (x_1 \lor x_2 \lor \neg x_3) \land (\neg x_1 \lor x_2 \lor \neg x_3) \land \ldots \land (x_2 \lor x_3)$$

n digits (1 per unique variable)

2n numbers (2 per unique variable)

x_1^{TRUE}	= 1	0	0	0	…	0
x_1^{FALSE}	= 1	0	0	0	…	0
x_2^{TRUE}	= 0	1	0	0	…	0
x_2^{FALSE}	= 0	1	0	0	…	0
x_3^{TRUE}	= 0	0	1	0	…	0
x_3^{FALSE}	= 0	0	1	0	…	0
…						
x_n^{TRUE}	= 0	0	0	0	…	1
x_n^{FALSE}	= 0	0	0	0	…	1
B	**= 1**	**1**	**1**	**1**	**…**	**1**

Each variable must be TRUE or FALSE

3-SAT $\leq_{\text{poly}}$ SUBSET-SUM: clauses

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3-SAT $\leq_{\text{poly}}$ SUBSET-SUM: **clauses**

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3-SAT $\leq_{\text{poly}}$ SUBSET-SUM: clauses

- We want our numbers to correspond to satisfying certain clauses
- For each number, we will add an extra digit for each clause
  - The extra digits signifiy which variables satisfy which clauses
- We will design our desired total so that (at least) one variable must be picked for each clause

3-SAT $\leq_{\text{poly}}$ SUBSET-SUM: clauses

$F = (x_1 \lor x_2 \lor \neg x_3) \land (\neg x_1 \lor x_2 \lor \neg x_3) \land \ldots \land (x_2 \lor x_3)$

m digits (1 per clause)

							c_1	c_2		c_m
x_1^{TRUE}	= 1	0	0	0	…	0	1	0	…	0
x_1^{FALSE}	= 1	0	0	0	…	0	0	1	…	0
x_2^{TRUE}	= 0	1	0	0	…	0	1	1	…	1
x_2^{FALSE}	= 0	1	0	0	…	0	0	0	…	0
x_3^{TRUE}	= 0	0	1	0	…	0	0	0	…	1
x_3^{FALSE}	= 0	0	1	0	…	0	1	1	…	0
…							…			
x_n^{TRUE}	= 0	0	0	0	…	1	0	0	…	0
x_n^{FALSE}	= 0	0	0	0	…	1	0	0	…	0
B	**= 1**	**1**	**1**	**1**	**…**	**1**	**?**	**?**	**…**	**?**

Which variables satisfy which clauses?

How do we ensure that each clause is satisfied?

3-SAT $\leq_{\text{poly}}$ SUBSET-SUM: clauses

3-SAT $\leq_{\text{poly}}$ SUBSET-SUM: clauses

- How do we design our target B so that each clause must be satisfied?

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- **Attempt 1:** Include a 1 digit for each clause

3-SAT $\leq_{\text{poly}}$ SUBSET-SUM: clauses

- How do we design our target B so that each clause must be satisfied?
- **Attempt 1:** Include a 1 digit for each clause
  - **Problem:** What if a clause has more than one TRUE variable?

3-SAT $\leq_{\text{poly}}$ SUBSET-SUM: clauses

- How do we design our target B so that each clause must be satisfied?
- **Attempt 1:** Include a 1 digit for each clause
  - **Problem:** What if a clause has more than one TRUE variable?
- **Attempt 2:** Include a 3 digit for each clause

3-SAT $\leq_{\text{poly}}$ SUBSET-SUM: clauses

- How do we design our target B so that each clause must be satisfied?
- **Attempt 1:** Include a 1 digit for each clause
  - **Problem:** What if a clause has more than one TRUE variable?
- **Attempt 2:** Include a 3 digit for each clause
  - **Problem:** A satisfied clause might have only 1 or 2 TRUE variables

3-SAT $\leq_{\text{poly}}$ SUBSET-SUM: clauses

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3-SAT $\leq_{\text{poly}}$ SUBSET-SUM: clauses

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  - **Problem:** A satisfied clause might have only 1 or 2 TRUE variables
- How do we represent "between 1 and 3" when subset sum requires an exact total?
- We will introduce **filler numbers**

3-SAT $\leq_{\text{poly}}$ SUBSET-SUM: fillers

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- For each clause, introduce two *fillers*

3-SAT $\leq_{\text{poly}}$ SUBSET-SUM: fillers

- For each clause, introduce two *fillers*
- From a given clause, if at least one variable is TRUE, we can use up to two fillers to bring the total for that clause to 3

3-SAT $\leq_{\text{poly}}$ SUBSET-SUM: fillers

- For each clause, introduce two *fillers*
- From a given clause, if at least one variable is TRUE, we can use up to two fillers to bring the total for that clause to 3
- If all variables in a clause are FALSE, then that clause will never add up to 3 (even with the fillers)

3-SAT $\leq_{\text{poly}}$ SUBSET-SUM: fillers

$F = (x_1 \lor x_2 \lor \neg x_3) \land (\neg x_1 \lor x_2 \lor \neg x_3) \land \ldots \land (x_2 \lor x_3)$

x_1^{TRUE}	= 1	0	0	0	…	0	1	0	…	0
x_1^{FALSE}	= 1	0	0	0	…	0	0	1	…	0
x_2^{TRUE}	= 0	1	0	0	…	0	1	1	…	1
x_2^{FALSE}	= 0	1	0	0	…	0	0	0	…	0
x_3^{TRUE}	= 0	0	1	0	…	0	0	0	…	1
x_3^{FALSE}	= 0	0	1	0	…	0	1	1	…	0
…							…			
x_n^{TRUE}	= 0	0	0	0	…	1	0	0	…	0
x_n^{FALSE}	= 0	0	0	0	…	1	0	0	…	0
$fill_{11}$	= 0	0	0	0	…	0	1	0	…	0
$fill_{12}$	= 0	0	0	0	…	0	1	0	…	0
$fill_{21}$	= 0	0	0	0	…	0	0	1	…	0
$fill_{22}$	= 0	0	0	0	…	0	0	1	…	0
…										
$fill_{m1}$	= 0	0	0	0	…	0	0	0	…	1
$fill_{m2}$	= 0	0	0	0	…	0	0	0	…	1
B	**= 1**	**1**	**1**	**1**	**…**	**1**	**3**	**3**	**…**	**3**

Fillers don't affect variable truth assignments

Can use up to 2 fillers per clause

Need ≥ 1 TRUE variable + ≤ 2 fillers

3-SAT $\leq_{\text{poly}}$ SUBSET-SUM

$F = (x_1 \vee x_2 \vee \neg x_3) \wedge (\neg x_1 \vee x_2 \vee \neg x_3) \wedge \ldots \wedge (x_2 \vee x_3)$

x_1^{TRUE}	= 1	0	0	0	…	0	1	0	…	0
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x_2^{TRUE}	= 0	1	0	0	…	0	1	1	…	1
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x_3^{TRUE}	= 0	0	1	0	…	0	0	0	…	1
x_3^{FALSE}	= 0	0	1	0	…	0	1	1	…	0
…							…			
x_n^{TRUE}	= 0	0	0	0	…	1	0	0	…	0
x_n^{FALSE}	= 0	0	0	0	…	1	0	0	…	0
$fill_{11}$	= 0	0	0	0	…	0	1	0	…	0
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$fill_{21}$	= 0	0	0	0	…	0	0	1	…	0
$fill_{22}$	= 0	0	0	0	…	0	0	1	…	0
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B	**= 1**	**1**	**1**	**1**	**…**	**1**	**3**	**3**	**…**	**3**

3-SAT $\leq_{\text{poly}}$ SUBSET-SUM: poly-time

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- $O(n)$ "variable" numbers

3-SAT $\leq_{\text{poly}}$ SUBSET-SUM: poly-time

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- $O(m)$ "filler" numbers

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- Each number has $O(n + m)$ base-10 digits

3-SAT $\leq_{\text{poly}}$ SUBSET-SUM: poly-time

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- $(O(n)+O(m)) \cdot O(n+m) =$ poly-time

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- **Note:** The length of the numbers would be exponential if we used a unary encoding

3-SAT $\leq_{\text{poly}}$ SUBSET-SUM: poly-time

- $O(n)$ "variable" numbers
- $O(m)$ "filler" numbers
- Each number has $O(n+m)$ base-10 digits
- $(O(n)+O(m)) \cdot O(n+m) =$ poly-time
- **Note:** The length of the numbers would be exponential if we used a unary encoding
  - If we could find a poly-time reduction that uses unary, we would have proven that $\mathrm{P} = \mathrm{NP}$

3-SAT $\leq_{\text{poly}}$ SUBSET-SUM: yes $\rightarrow$ yes

"YES maps to YES":

3-SAT $\leq_{\text{poly}}$ SUBSET-SUM: yes $\to$ yes

"YES maps to YES":

- Suppose F has a satisfying assignment

3-SAT $\leq_{\text{poly}}$ SUBSET-SUM: yes $\rightarrow$ yes

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- If x_i is assigned TRUE, include x_i^{TRUE} in our subset. Otherwise, include x_i^{FALSE}

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- A variable and its negation will never both be assigned TRUE, so we have a 1 in the first n positions of B

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- Each clause is satisfied, so we have at least 1 in the last m positions of B

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"YES maps to YES":

- Suppose F has a satisfying assignment
- If x_i is assigned TRUE, include x_i^{TRUE} in our subset. Otherwise, include x_i^{FALSE}
- A variable and its negation will never both be assigned TRUE, so we have a 1 in the first n positions of B
- Each clause is satisfied, so we have at least 1 in the last m positions of B
- Can use up to 2 fillers to get a 3 in the last m positions of B

3-SAT $\leq_{\text{poly}}$ SUBSET-SUM: no $\rightarrow$ no

"NO maps to NO":

3-SAT $\leq_{\text{poly}}$ SUBSET-SUM: no $\rightarrow$ no

"NO maps to NO":

- Suppose F is unsatisfiable

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3-SAT $\leq_{\text{poly}}$ SUBSET-SUM: no $\rightarrow$ no

"<u>NO maps to NO</u>":

- Suppose F is unsatisfiable
- Every satisfying assignment will leave at least one clause unsatisfied
- One of the last m digits of our subset will add up to at most 2
  - Without at least one TRUE variable, we don't have enough fillers to make that clause add up to 3

3-SAT $\leq_{\text{poly}}$ SUBSET-SUM: no $\rightarrow$ no

Alternately, we can prove the contrapositive: yes $\leftarrow$ yes

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Alternately, we can prove the contrapositive: yes $\leftarrow$ yes

- Suppose there exists a subset that adds up to B
- Assign all of the variables that are part of the subset to be TRUE

3-SAT $\leq_{\text{poly}}$ SUBSET-SUM: no $\rightarrow$ no

Alternately, we can prove the contrapositive: yes $\leftarrow$ yes

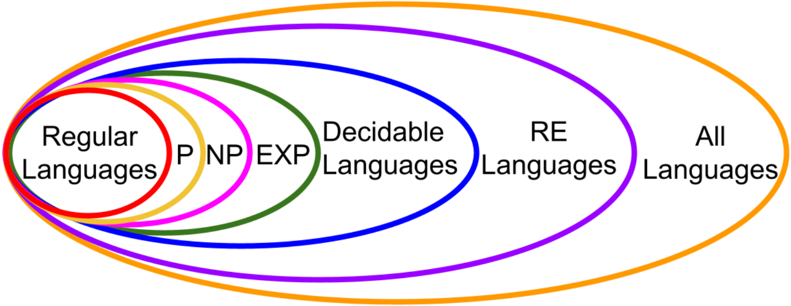
- Suppose there exists a subset that adds up to B
- Assign all of the variables that are part of the subset to be TRUE
- Because the first n digits of B are 1, we won't have a variable and its negation both be TRUE

3-SAT $\leq_{\text{poly}}$ SUBSET-SUM: no $\rightarrow$ no

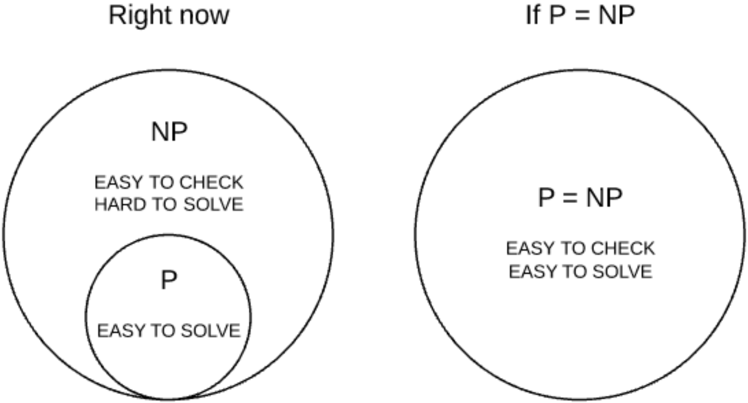
Alternately, we can prove the contrapositive: yes $\leftarrow$ yes

- Suppose there exists a subset that adds up to B
- Assign all of the variables that are part of the subset to be TRUE
- Because the first n digits of B are 1, we won't have a variable and its negation both be TRUE
- Because the last m digits of B are all 3, and there are only 2 fillers per clause, at least one variable is TRUE in each clause

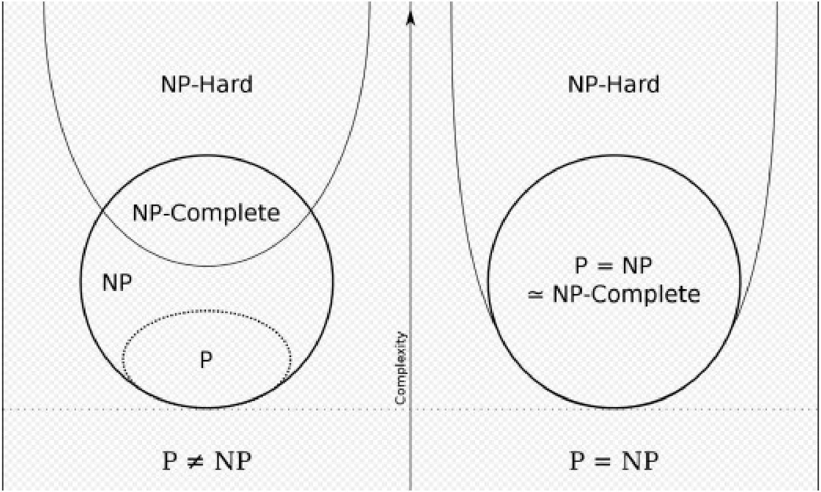
P vs. NP


Regular
Languages
P
NP
EXP
Decidable
Languages
RE
Languages
All
Languages

P vs. NP


Right now
NP
EASY TO CHECK
HARD TO SOLVE
P
EASY TO SOLVE
If P = NP
P = NP
EASY TO CHECK
EASY TO SOLVE

P vs. NP


NP-Hard
NP-Complete
NP
P
Complexity
P ≠ NP
NP-Hard
P = NP
≃ NP-Complete
P = NP

The million dollar question

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There is a million dollar bounty on the answer to this question!

Beyond P vs. NP: the class $\mathrm{co\text{-}NP}$

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Def: The class $\mathrm{co\text{-}NP}$ is the set of languages whose complement is in NP

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Beyond P vs. NP: the class $\mathrm{co\text{-}NP}$

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- It is easy to verify if $w \notin L$

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- **Example:** it is very easy to prove that a number is *not* prime (but harder to prove that it is prime)

Beyond P vs. NP: the class co-NP

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- **Example:** it is very easy to prove that a number is *not* prime (but harder to prove that it is prime)
- Some open questions:
  - Does $\mathrm{NP} = \mathrm{co\text{-}NP}$?
  - Does $P = \mathrm{NP} \cap \mathrm{co\text{-}NP}$ (similar to how decidable $=$ RE $\cap$ co-RE)?

Beyond P vs. NP: the class PSPACE

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  - Does PSPACE = EXP?