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- Most mathematicians believe that  $P \neq NP$ .
- This is one of the most important unsolved problems in mathematics.

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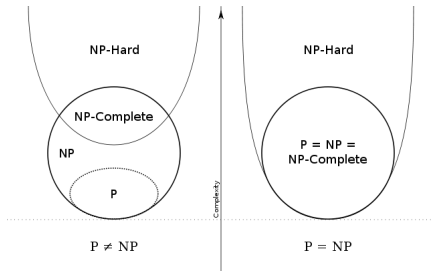
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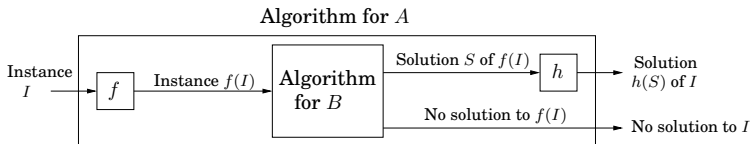
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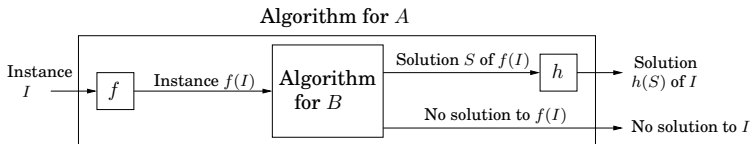
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- If such a reduction exists, it implies that  $B$  is at least as hard as  $A$ .



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We will use 3-SAT to show that Independent Set is NP-complete.

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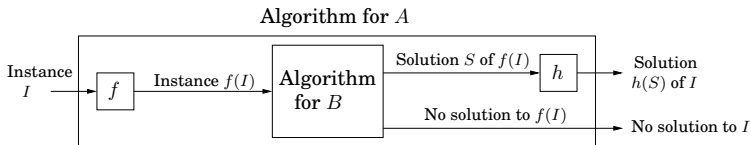
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3SAT  $\rightarrow$  Independent Set

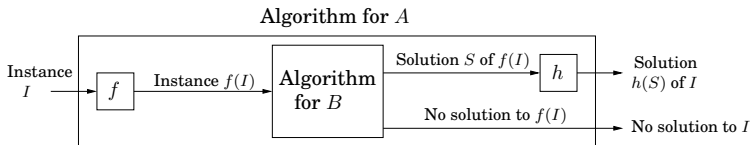


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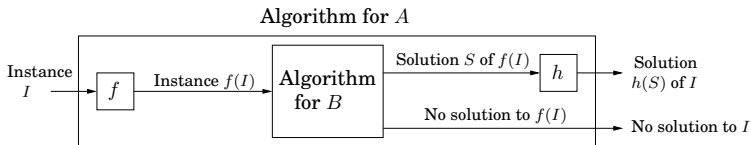


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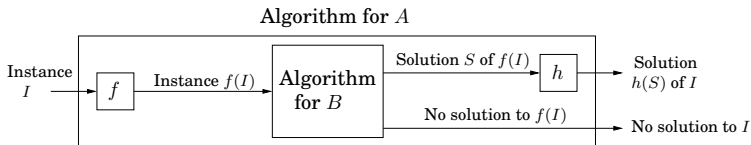
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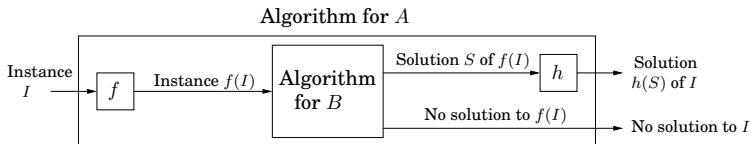
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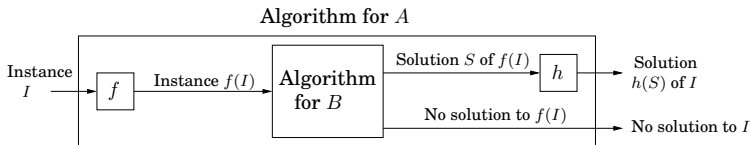
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We need to relate Boolean logic with graphs.

3SAT  $\rightarrow$  Independent Set



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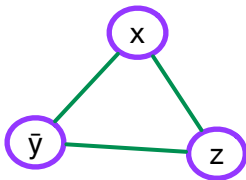
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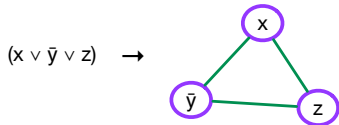


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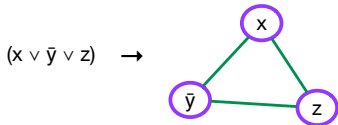
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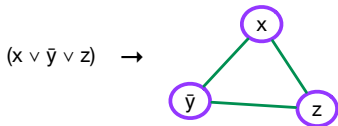
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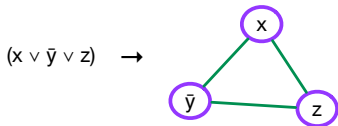
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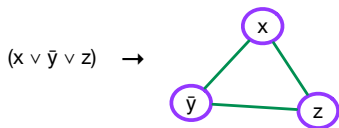


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- Repeat this construction for all clauses.



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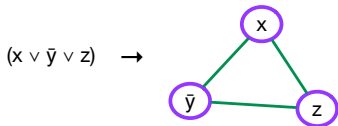
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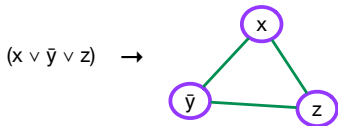
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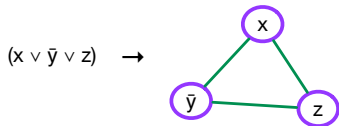
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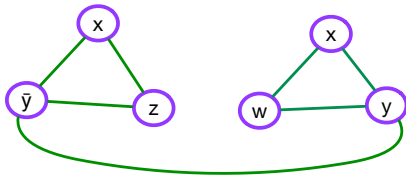
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3SAT  $\rightarrow$  Independent Set



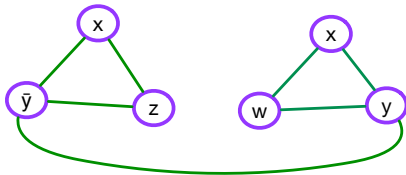
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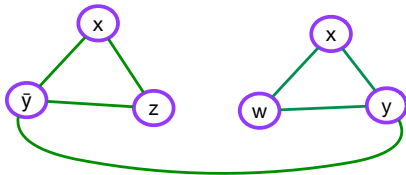
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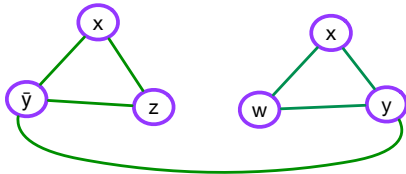
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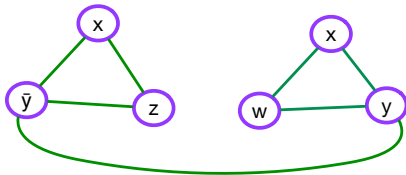


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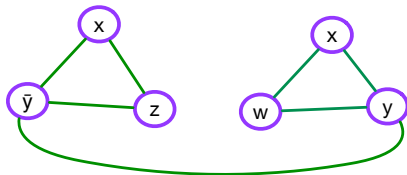
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- If there are  $n$  clauses in  $I$ ,  $f(I)$  is the graph described above with value  $g = n$ .

3SAT  $\rightarrow$  Independent Set



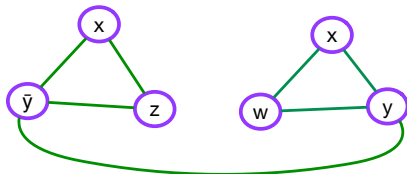
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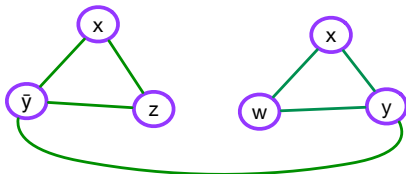
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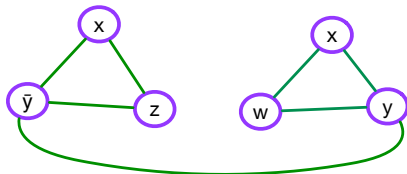


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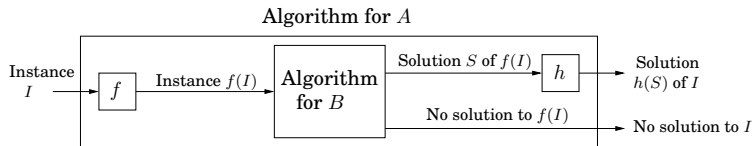
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- $h$  simply takes the labels of all of the vertices in the independent set and sets their value to true.

3SAT  $\rightarrow$  Independent Set

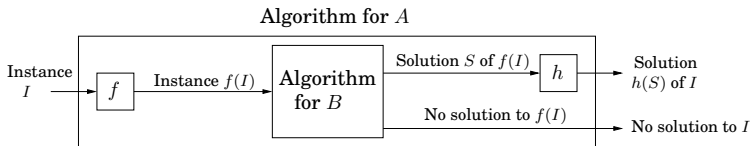




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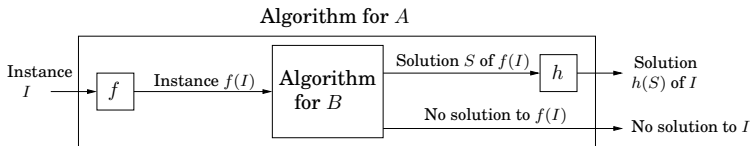


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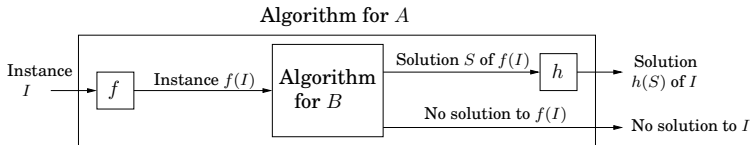
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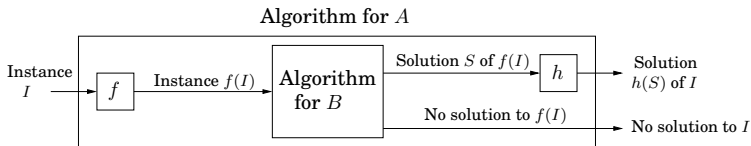
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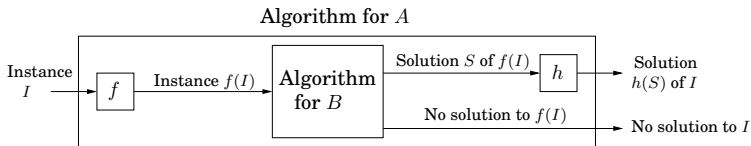
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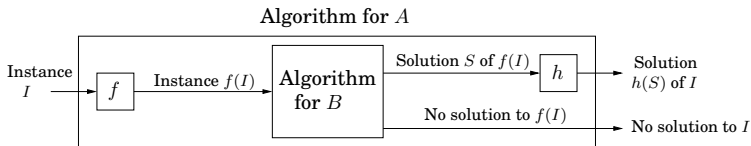
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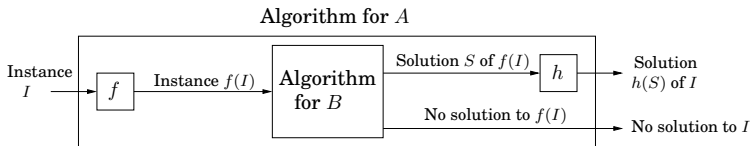
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  - The Boolean formula is not satisfiable.



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What is the corresponding graph and threshold for the independent set problem?

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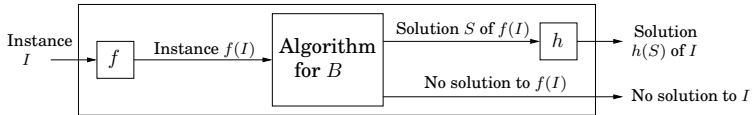
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## Independent Set $\rightarrow$ Vertex Cover



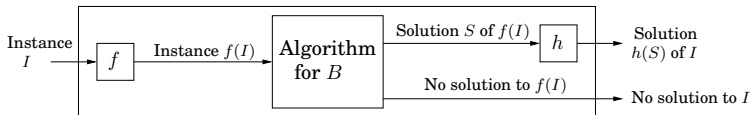
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## Algorithm for $A$



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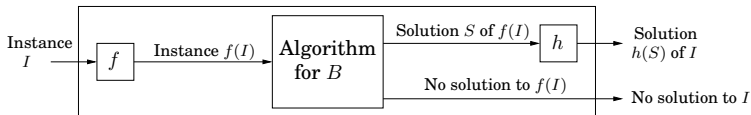
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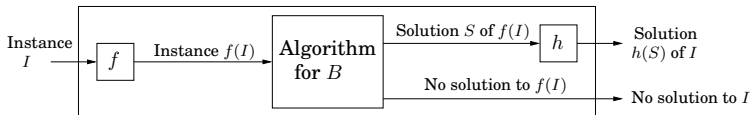
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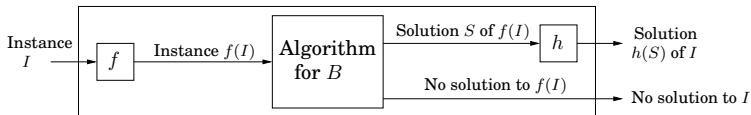
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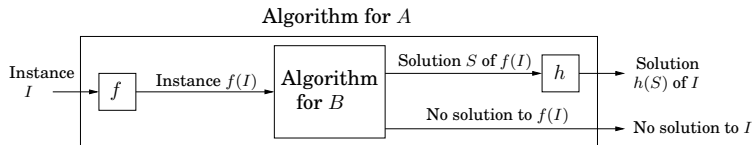


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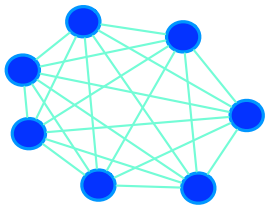
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Example ( $K_7$ ):

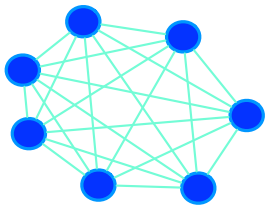


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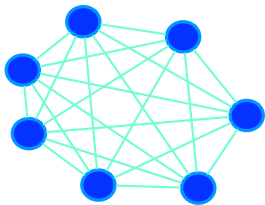


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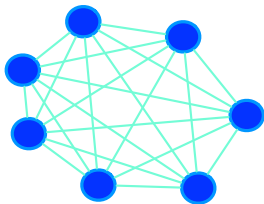
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Independent Set  $\rightarrow$  Clique



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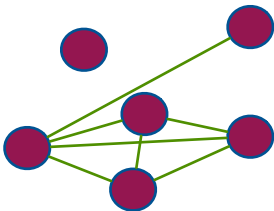
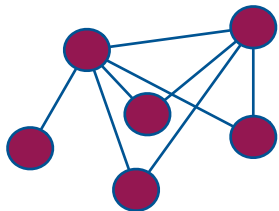
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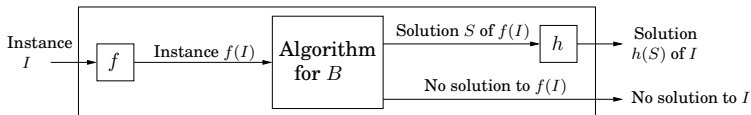


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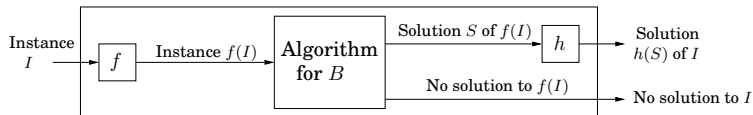
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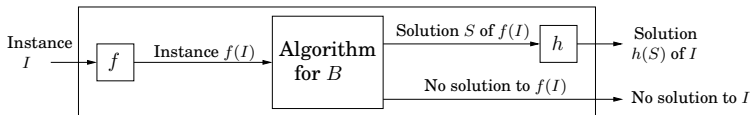
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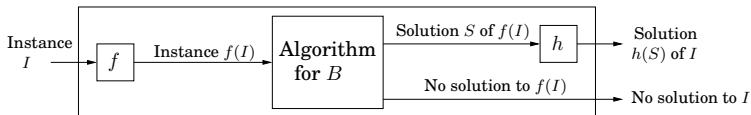
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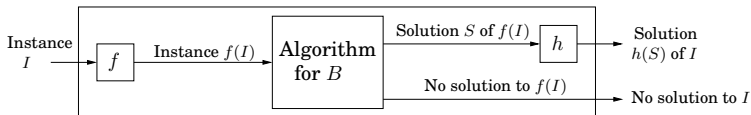
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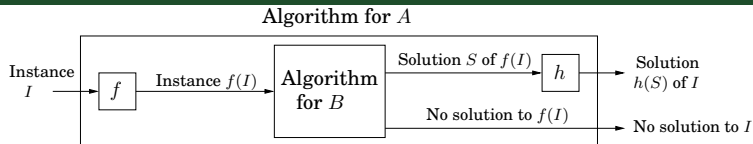


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