

Reduction of NP Problems & Property-Based Testing

Chenhao Zhang

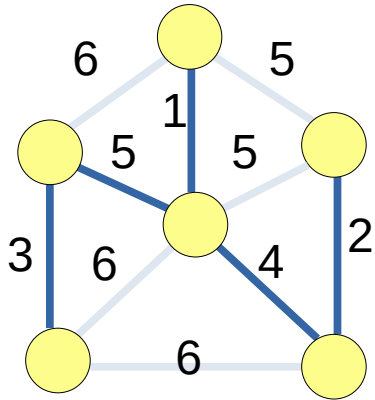
CS396 Fall 2023
Northwestern

Plan of the week

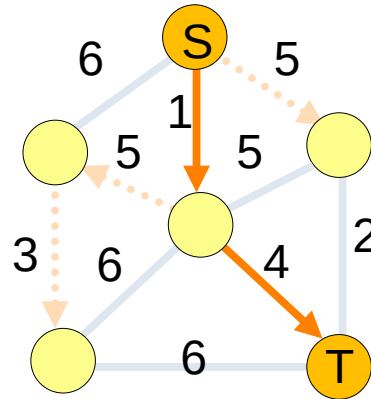
- **NP Problem & Reduction (Today)**
- Examples, Reduction in Karp -- Wednesday
- Lab, Assignment 5 -- Friday

Many problems have efficient algorithms

Minimum Spanning Tree



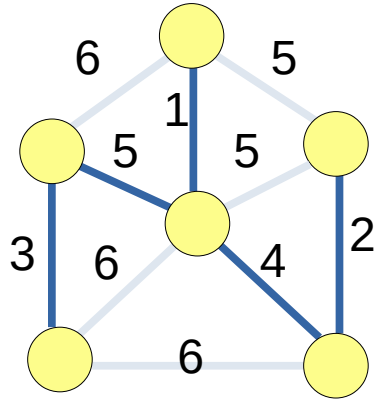
Shortest path



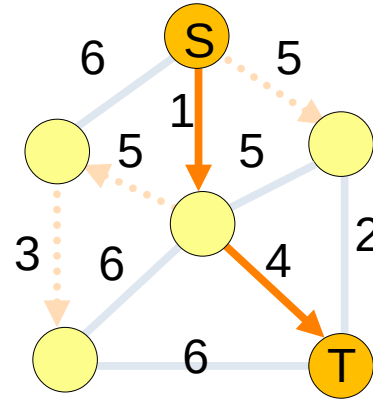
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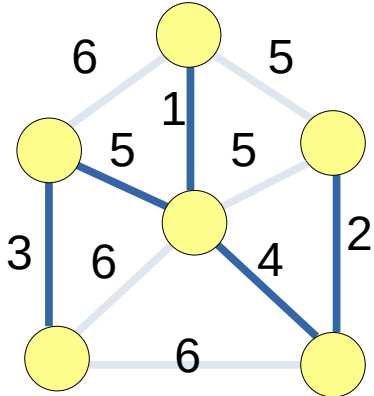
Shortest path



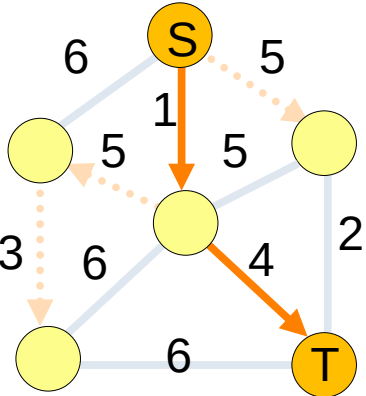
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version with Yes/No answer

Has Spanning Tree w/ Cost ≤ 15 ?



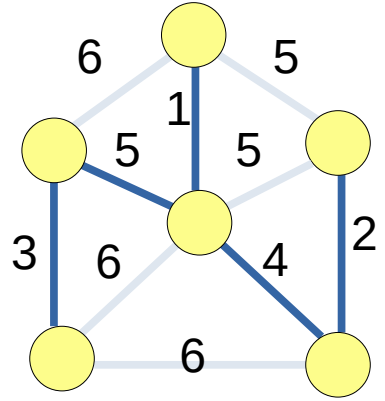
Has S-T path w/ Cost ≤ 5 ?



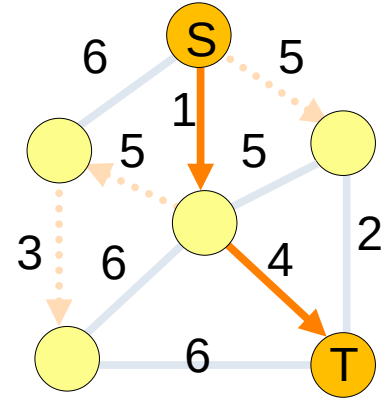
.....

version with Yes/No answer – *decision problem*

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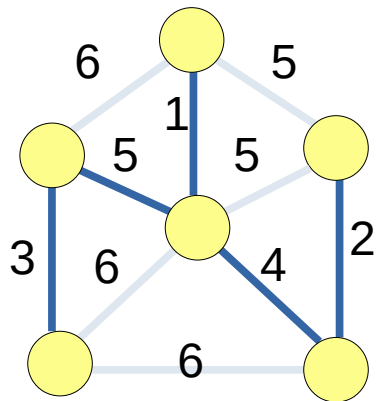
Has S-T path w/ Cost ≤ 5 ?



.....

version with Yes/No answer – *decision problem*

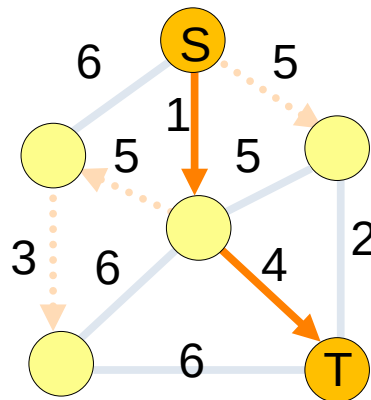
Has Spanning Tree w/ Cost ≤ 15 ?



$$1+5+3+4+2=15$$

.....

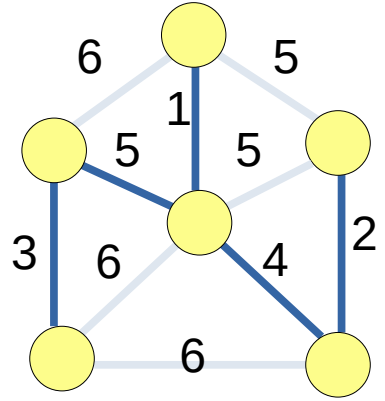
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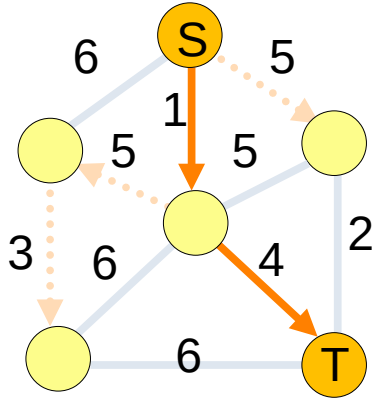


Yes

$$1+5+3+4+2=15$$

.....

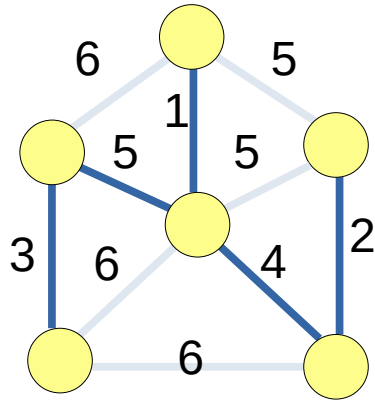
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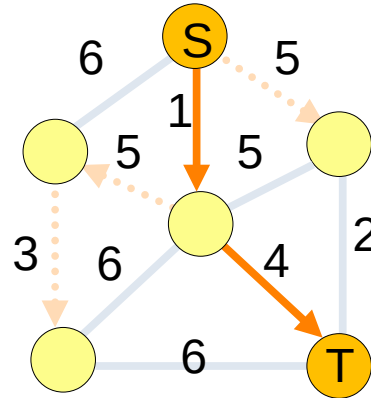


$$1+5+3+4+2=15$$

Yes

.....

Has S-T path w/ Cost ≤ 5 ?

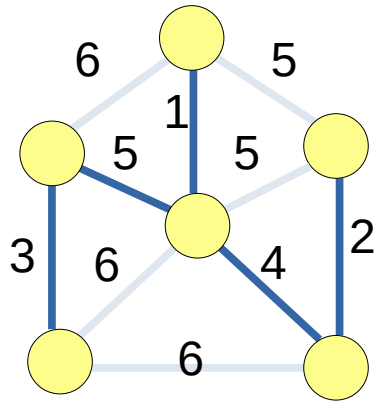


$$1+4=5$$

Yes

Yes-Instance has a *certificate*, i.e., proof of yes

Has Spanning Tree w/ Cost ≤ 15 ?

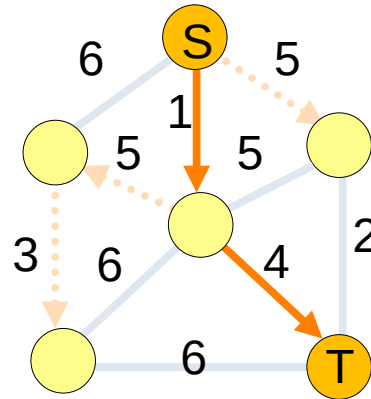


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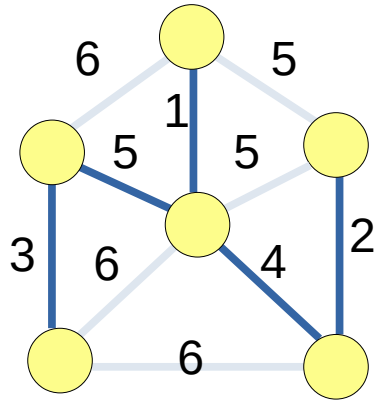


$$1+4=5$$

Yes

No-Instance has no *certificate*, ~~proof of yes~~

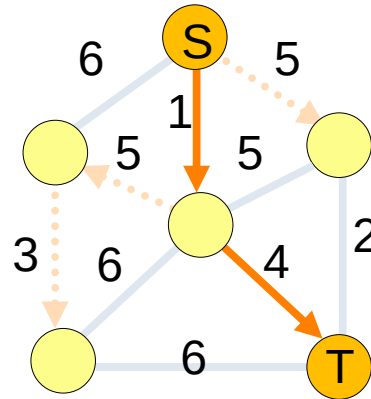
Has Spanning Tree w/ Cost ≤ 14 ?



$$1+5+3+4+2=15 > 14$$

.....

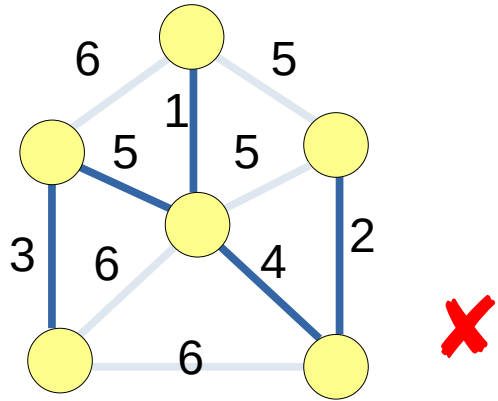
Has S-T path w/ Cost ≤ 4 ?



$$1+4=5 > 4$$

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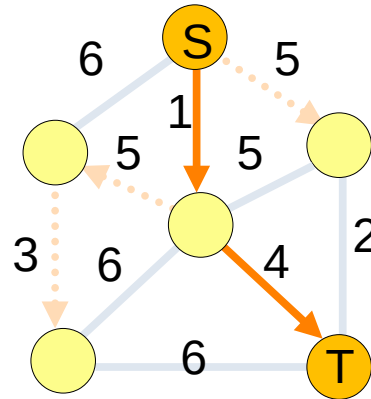
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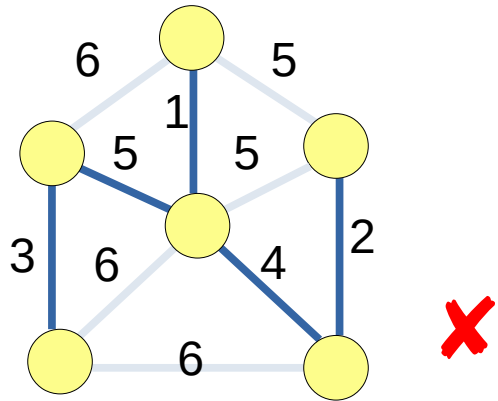
Has S-T path w/ Cost ≤ 4 ?



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No-Instance has no *certificate*, ~~proof of yes~~

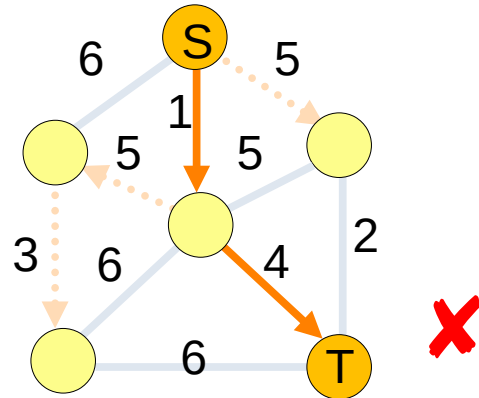
Has Spanning Tree w/ Cost ≤ 14 ?



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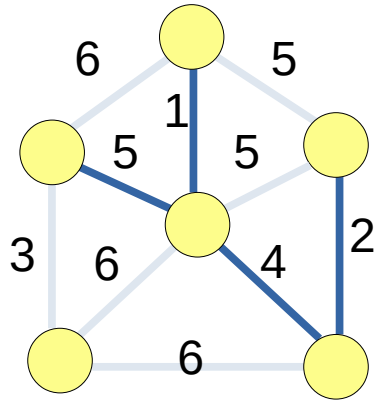
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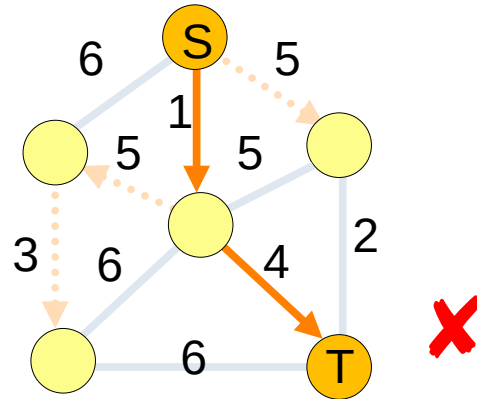
Has Spanning Tree w/ Cost ≤ 14 ?



$$1+5+4+2=12 \leq 14$$

.....

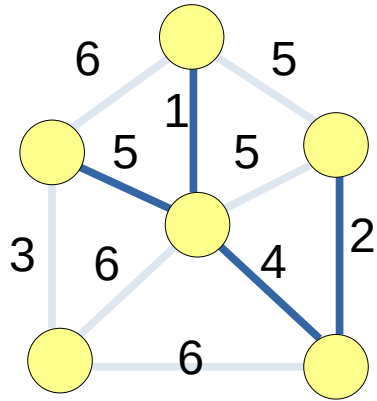
Has S-T path w/ Cost ≤ 4 ?



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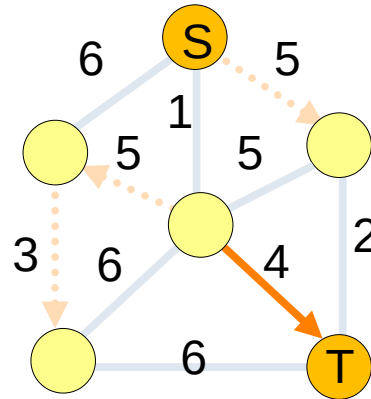
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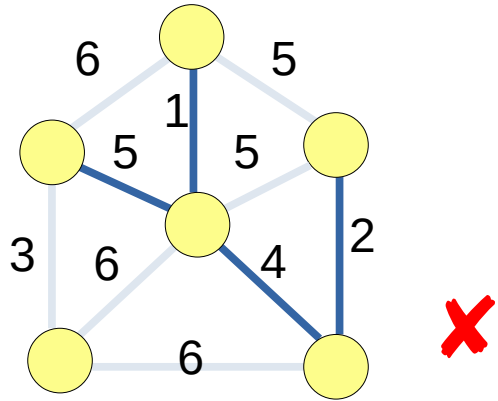
Has S-T path w/ Cost ≤ 4 ?



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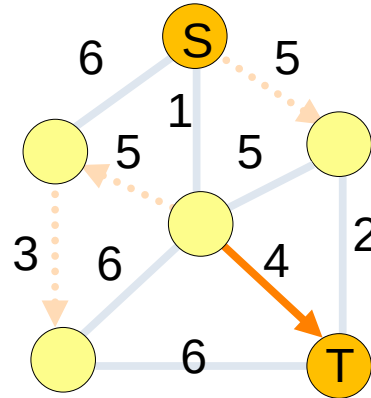
Has Spanning Tree w/ Cost ≤ 14 ?



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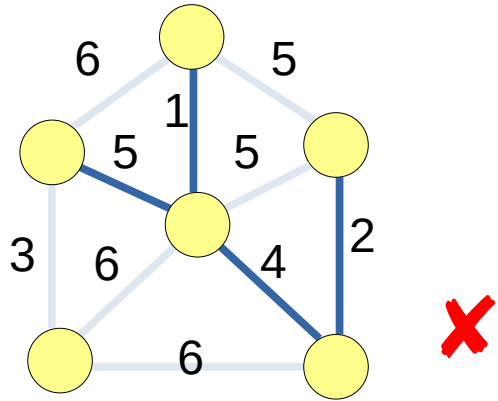
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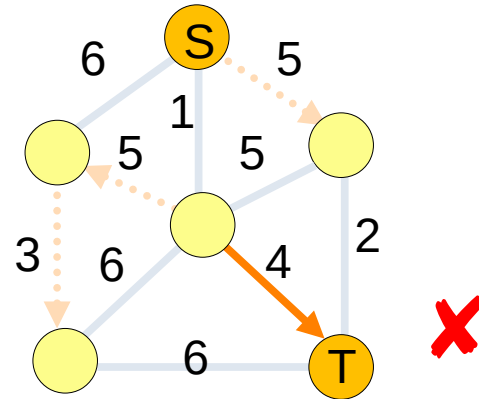
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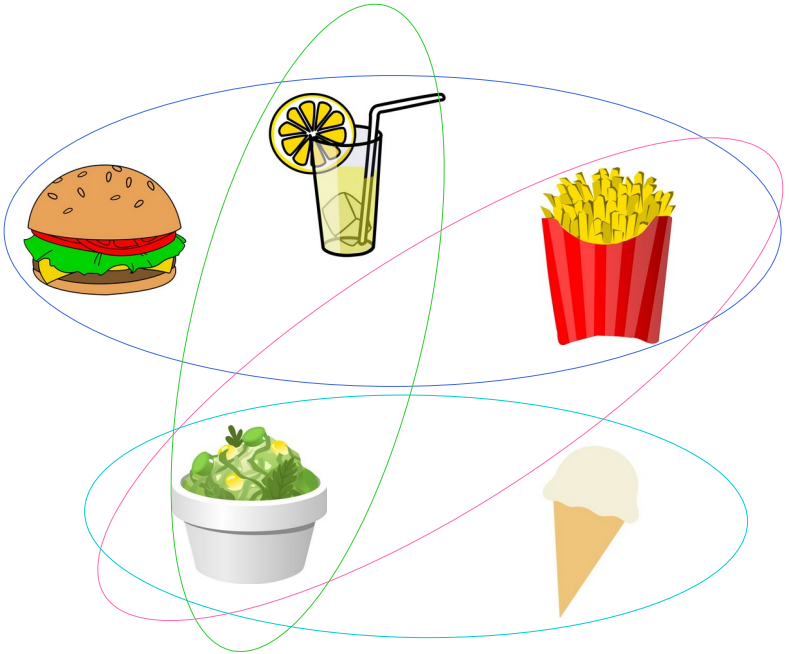


Has S-T path w/ Cost ≤ 4 ?



There are also many other problems...

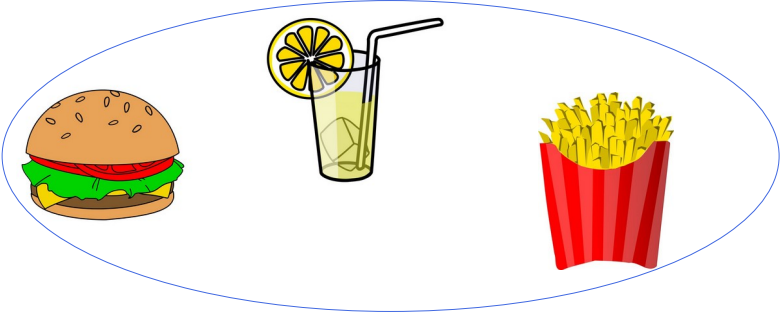
Can we get all by buying only 2 bundles?



SET-COVER

There are also many other problems...

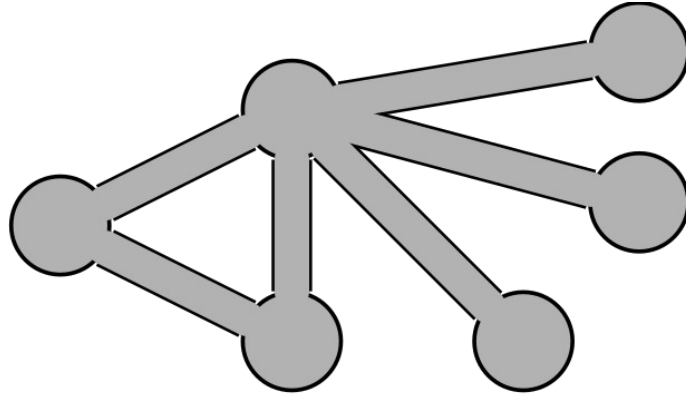
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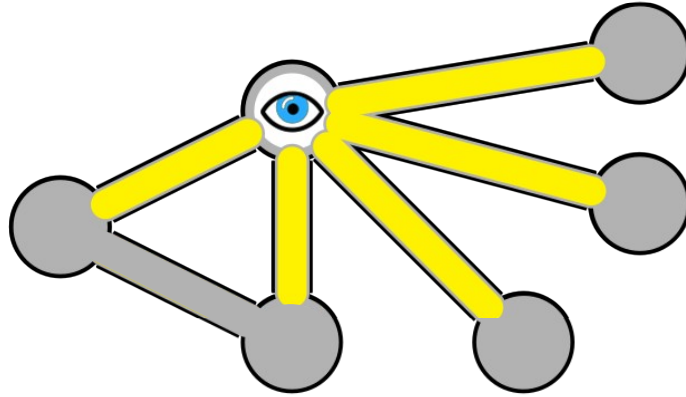
Can we watch all roads by setting only **2** sentry points?



VERTEX-COVER

There are also many other problems...

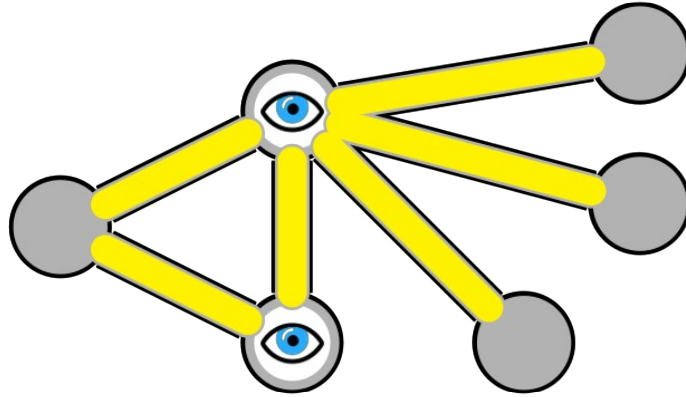
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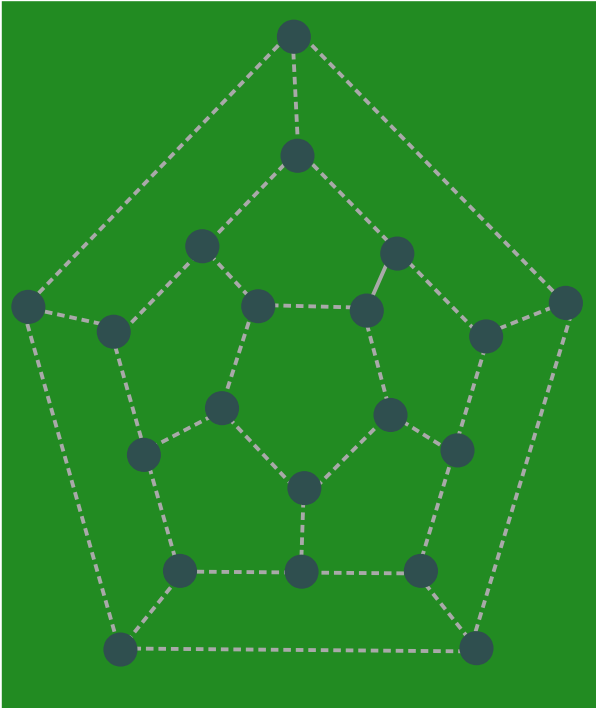
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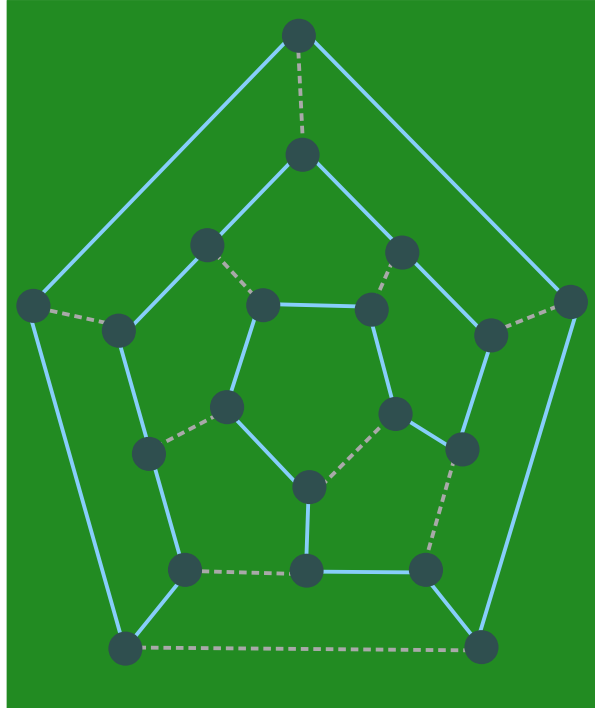
Is there a cycle that visits all vertices?



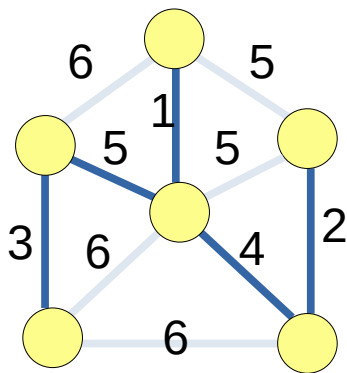
HAMILTONIAN-CYCLE

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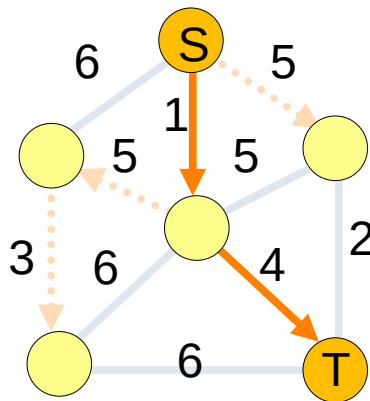
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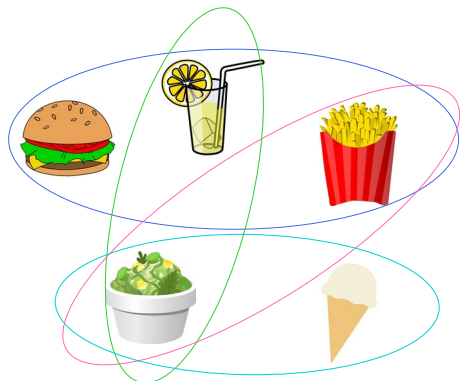
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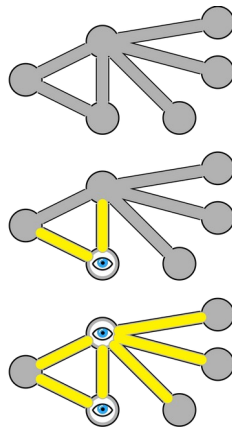
MINIMUM-SPANNING-TREE



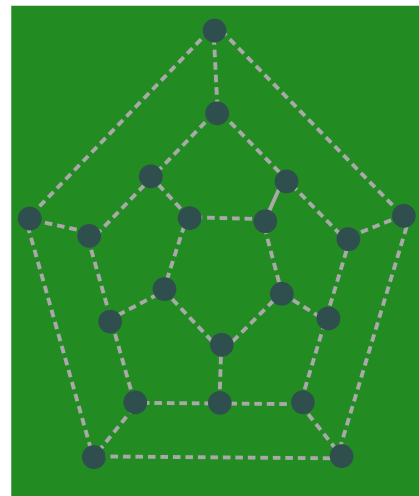
SHORTEST-PATH



SET-COVER



VERTEX-COVER



HAMILTONIAN-CYCLE

Q: What do they have in common?

SET-COVER

VERTEX-COVER

HAMILTONIAN-CYCLE

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A: Validity of **certificate EASY to check!
(can be done in **polynomial-time**)**

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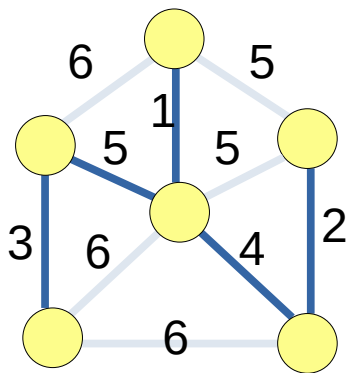
$$O(n) \quad O(n^2) \quad O(n^{10^{10}}) \quad \del{O(1.01^n)}$$

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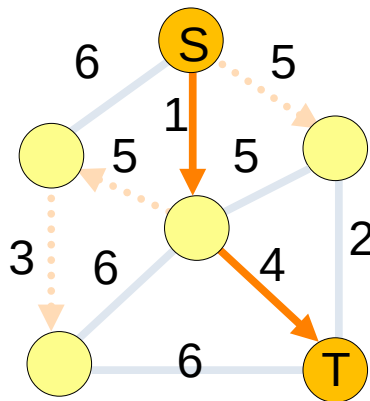
A: Validity of certificate EASY to check!
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NP-Problems

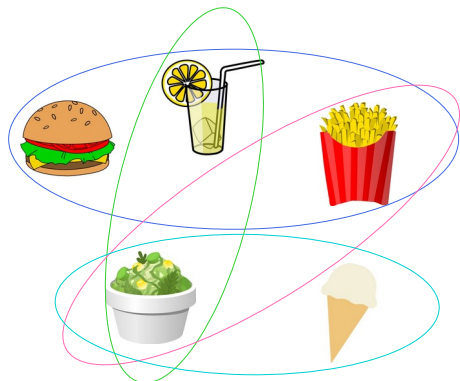
(Non-deterministic Polynomial-time)



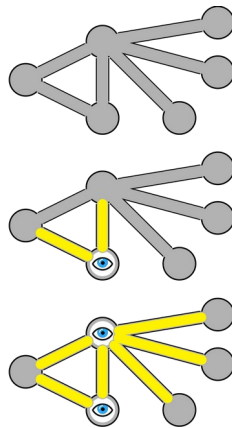
MINIMUM-SPANNING-TREE



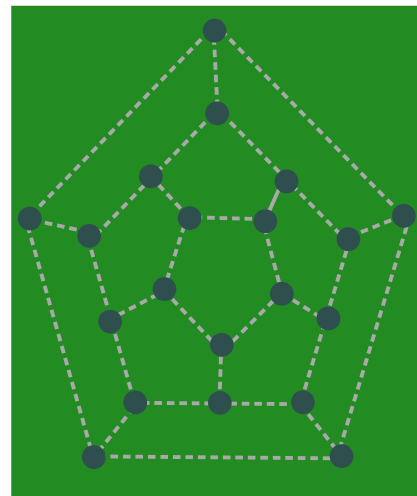
SHORTEST-PATH



SET-COVER



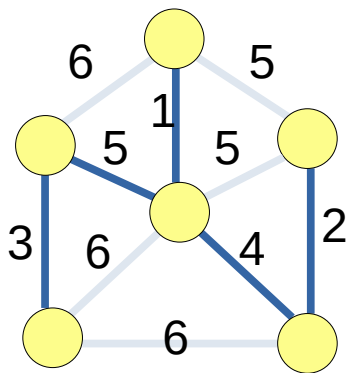
VERTEX-COVER



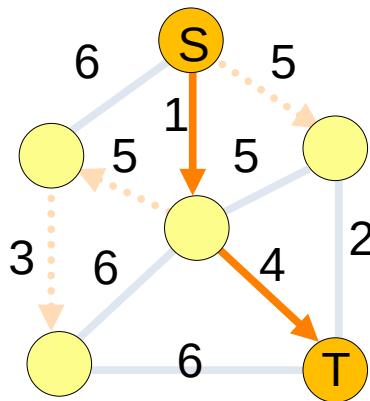
HAMILTONIAN-CYCLE

Q: Any difference?

“Easy”

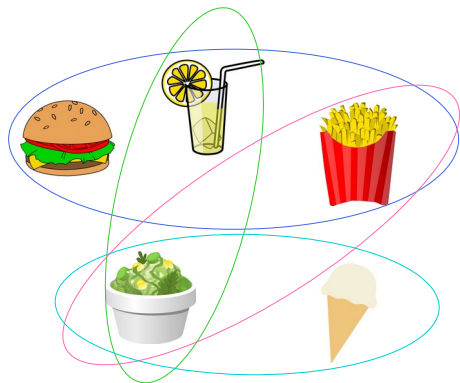


MINIMUM-SPANNING-TREE

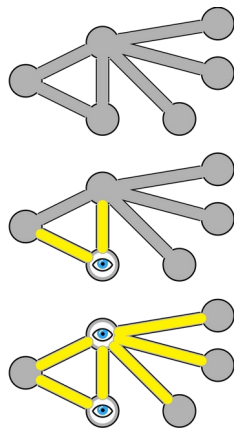


SHORTEST-PATH

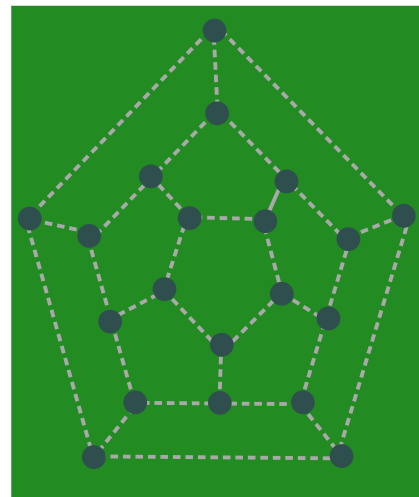
“Hard”



SET-COVER



VERTEX-COVER



HAMILTONIAN-CYCLE

Q: Any difference?

A: It is generally believed that:
“Hard” problems have NO efficient algorithms

Q: Any difference?

A: It is **generally believed that:**

“Hard” problems have NO efficient algorithms

But there’s no proof for it yet...

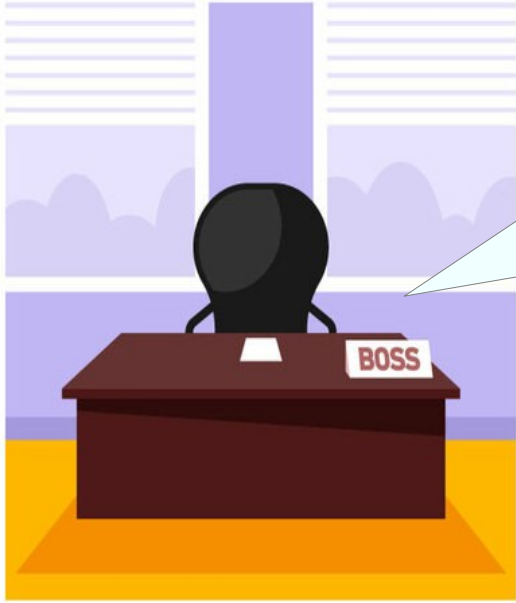
Q: Any difference?

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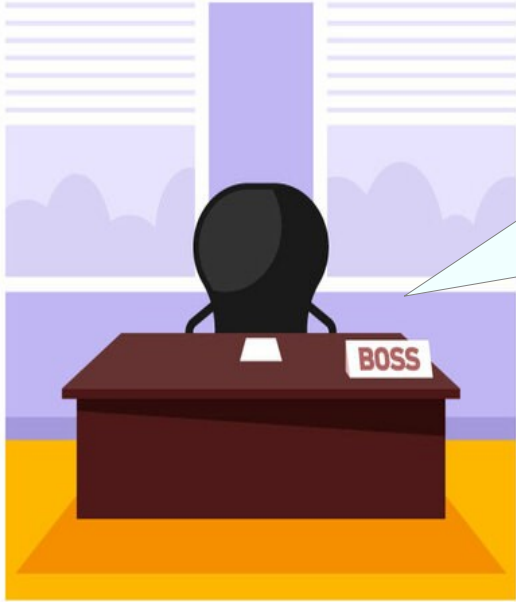
But there's no proof for it yet...

How do you prove that an NP-problem is “Hard”?



**Design an efficient algorithm
for problem N!**

How do you prove that an NP-problem is “Hard”?



**Design an efficient algorithm
for problem N!**

But... problem N is “Hard”

How do you prove that an NP-problem is “Hard”?



If N could be solved,
a known hard problem H
could be also solved.

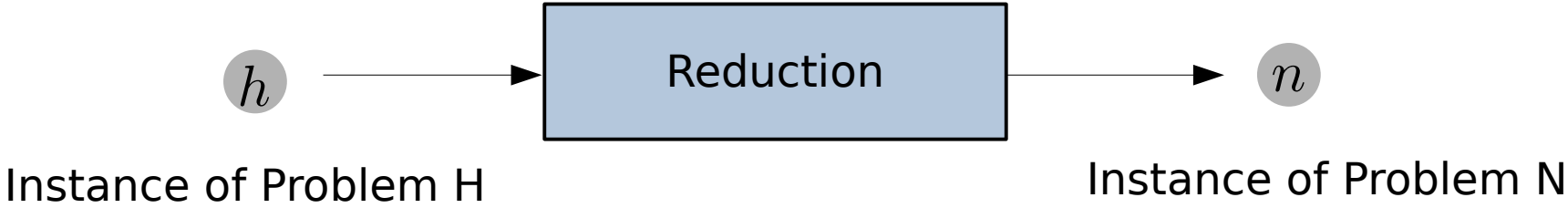
How do you prove that an NP-problem is “Hard”?



“reduction”

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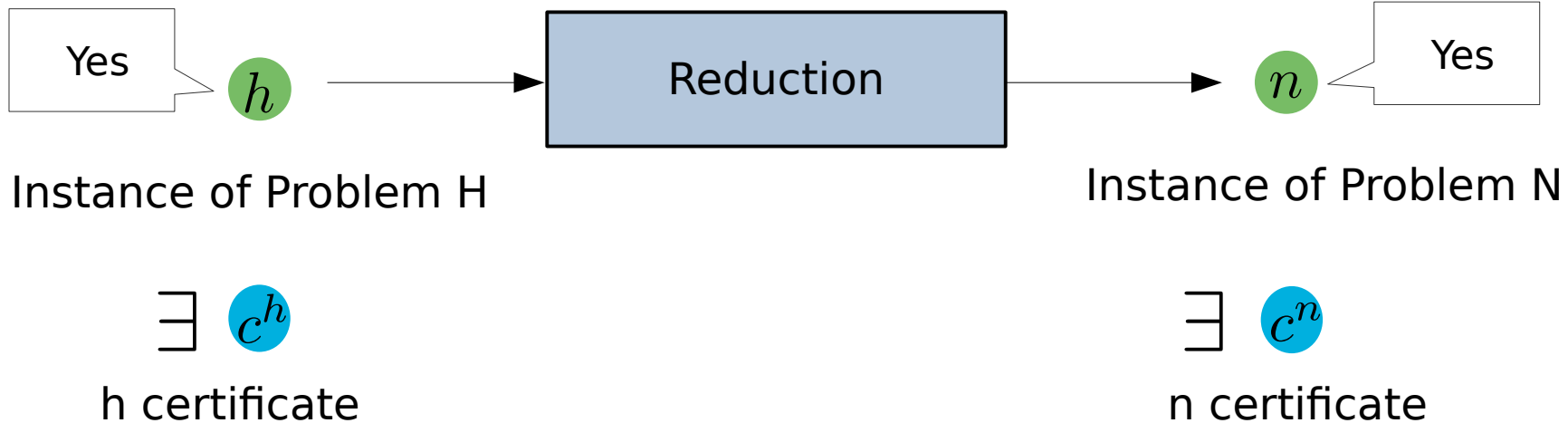
One-Call Reduction



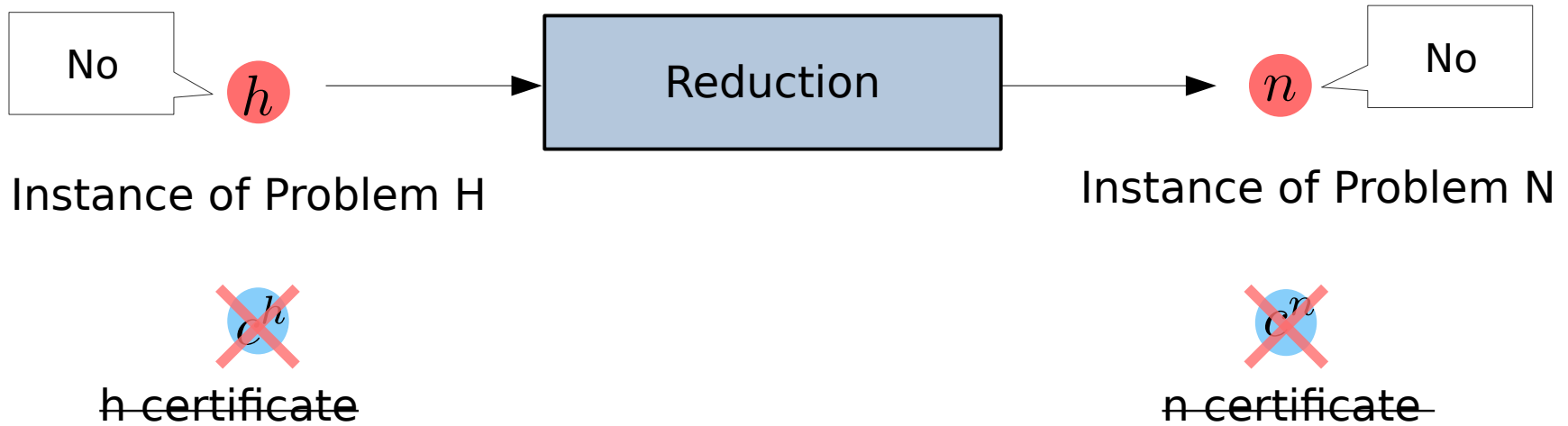
One-Call Reduction – Correctness Property

H is the problem known to be hard

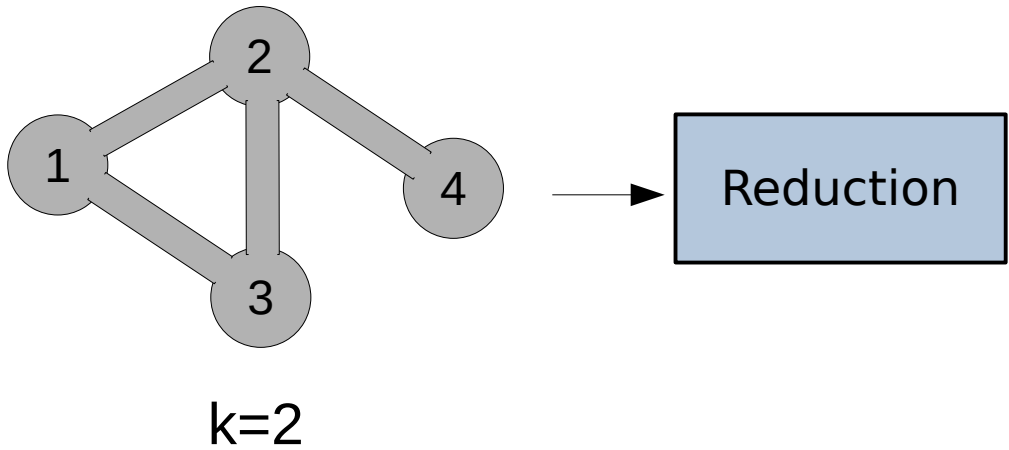
n is the new problem



One-Call Reduction – Correctness Property



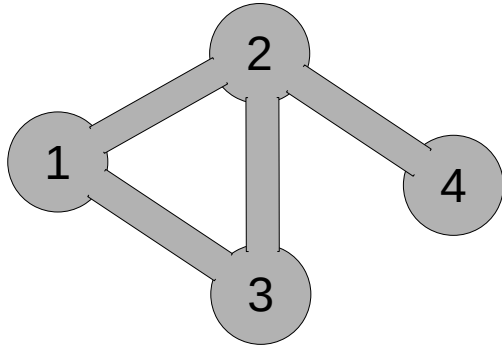
One-Call Reduction



VERTEX-COVER

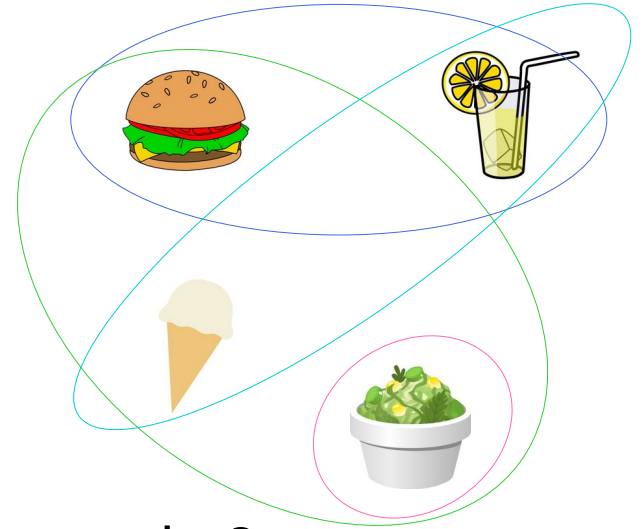
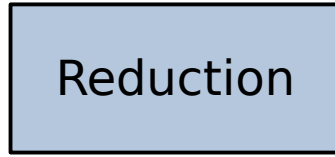
SET-COVER

One-Call Reduction



$k=2$

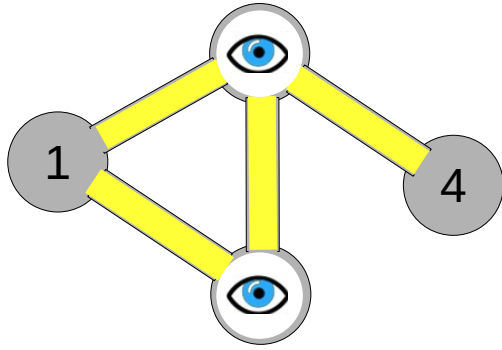
VERTEX-COVER



$k=2$

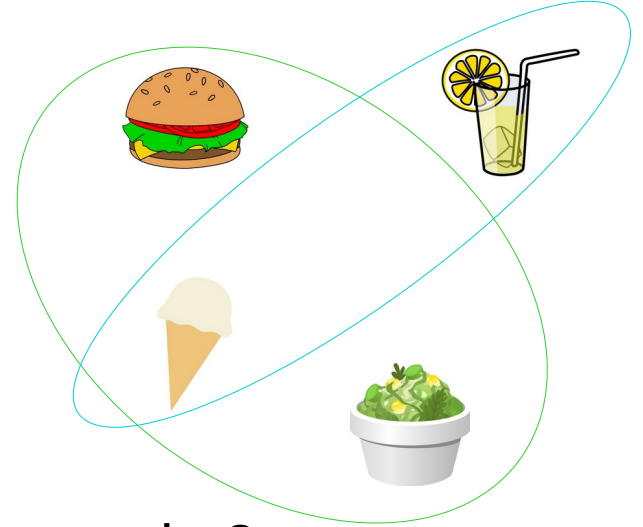
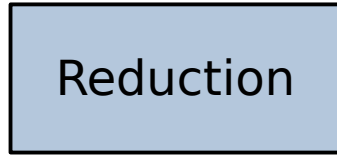
SET-COVER

One-Call Reduction



$k=2$

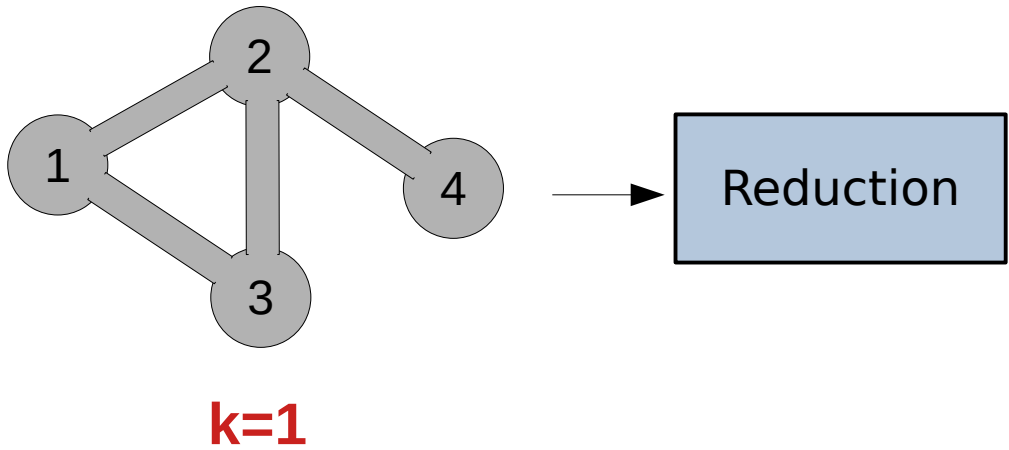
VERTEX-COVER



$k=2$

SET-COVER

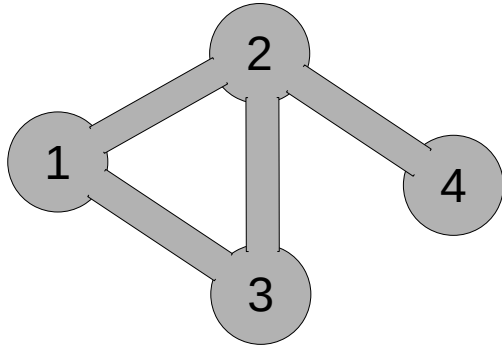
One-Call Reduction



VERTEX-COVER

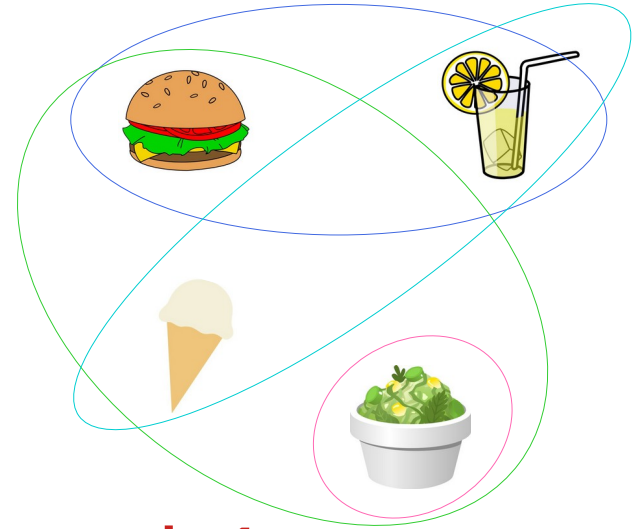
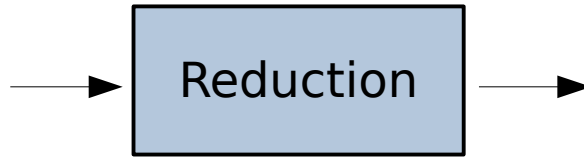
SET-COVER

One-Call Reduction



k=1

VERTEX-COVER



k=1

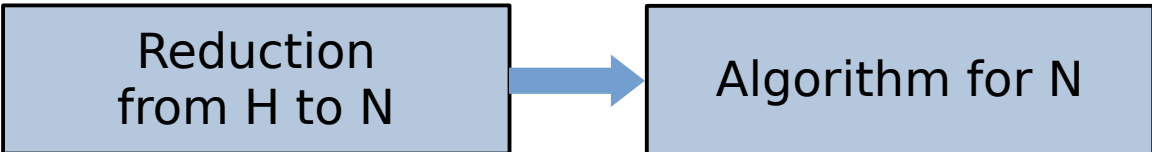
SET-COVER

One-Call Reduction

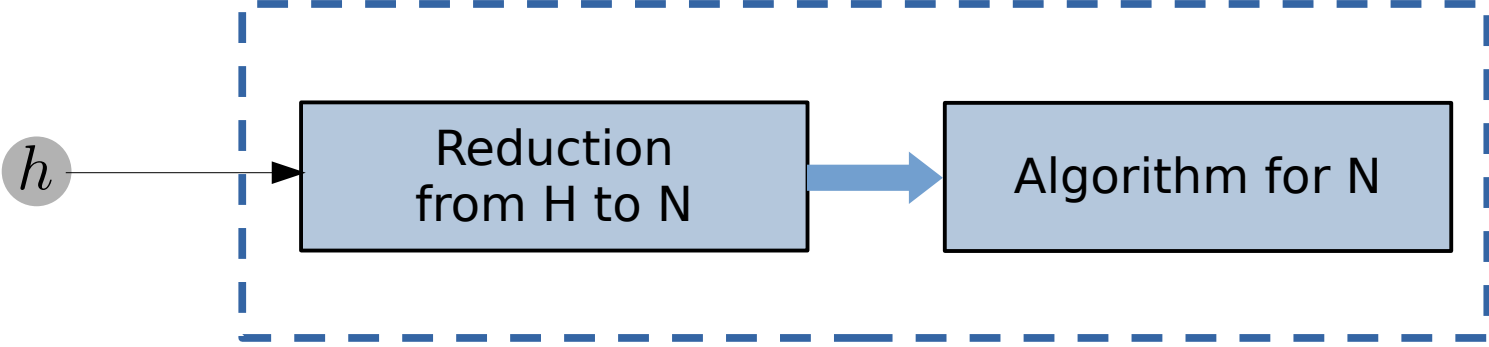
**Suppose there is an
algorithm for N**

Algorithm for N

One-Call Reduction

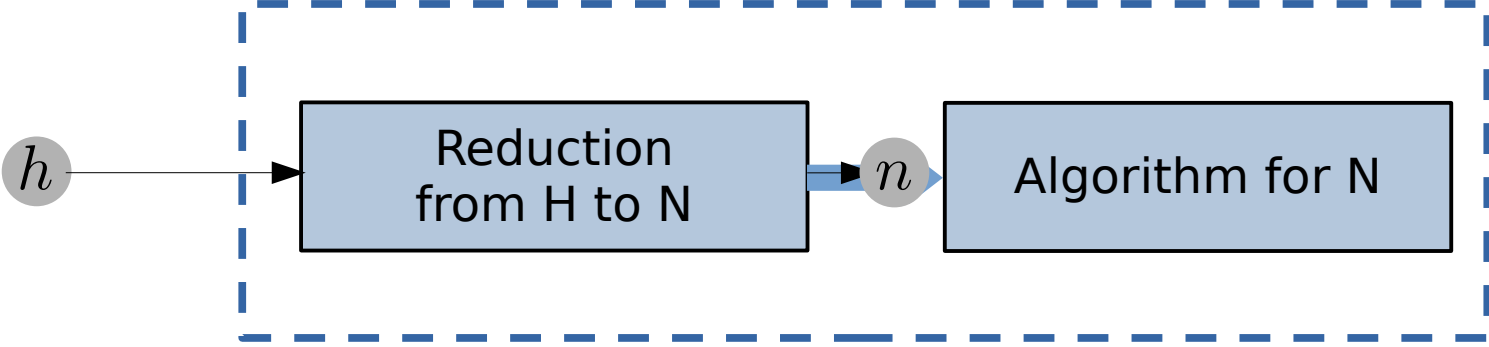


One-Call Reduction



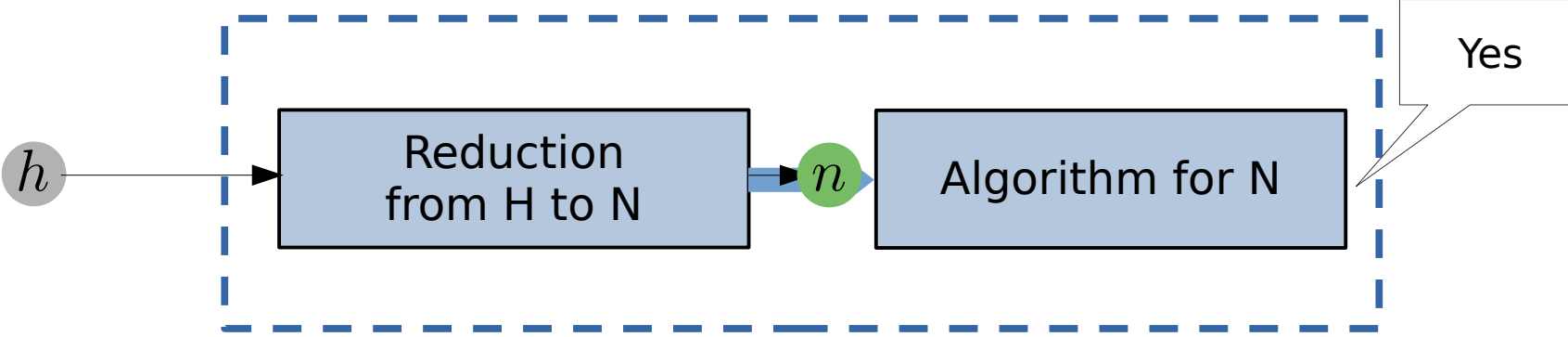
Algorithm for H

One-Call Reduction



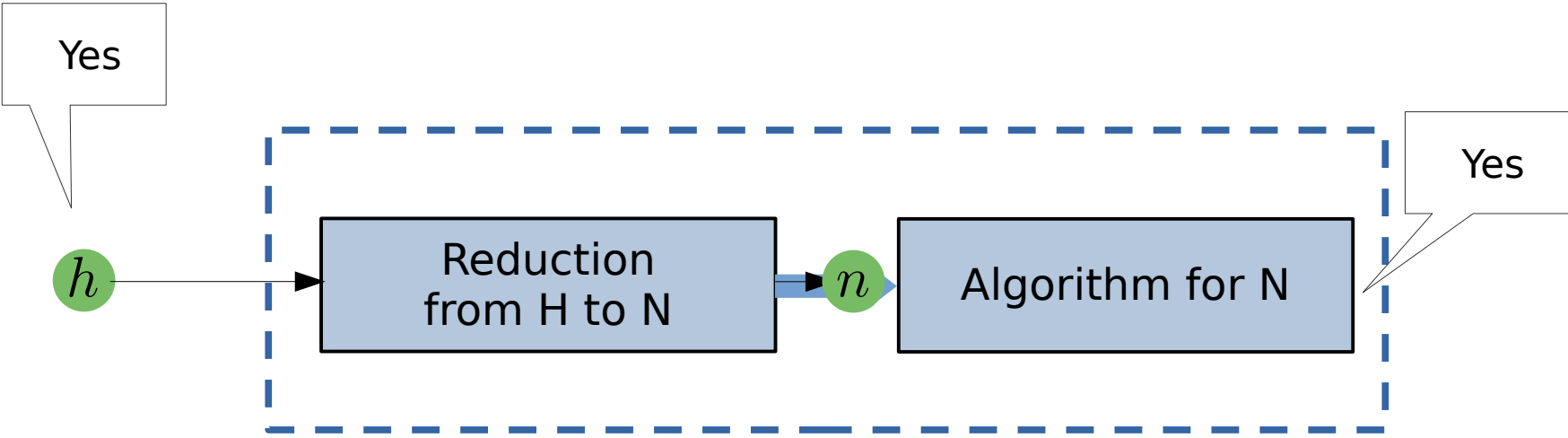
Algorithm for H

One-Call Reduction



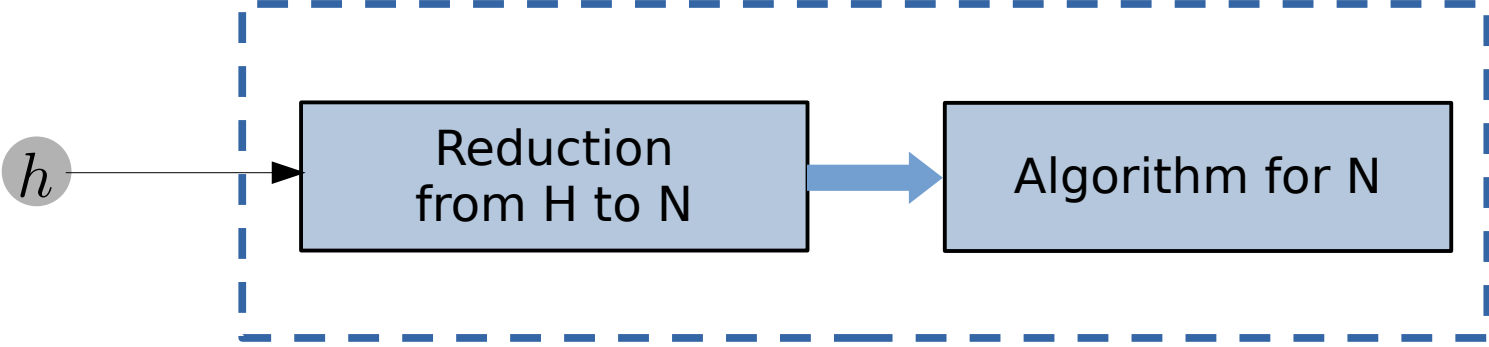
Algorithm for H

One-Call Reduction



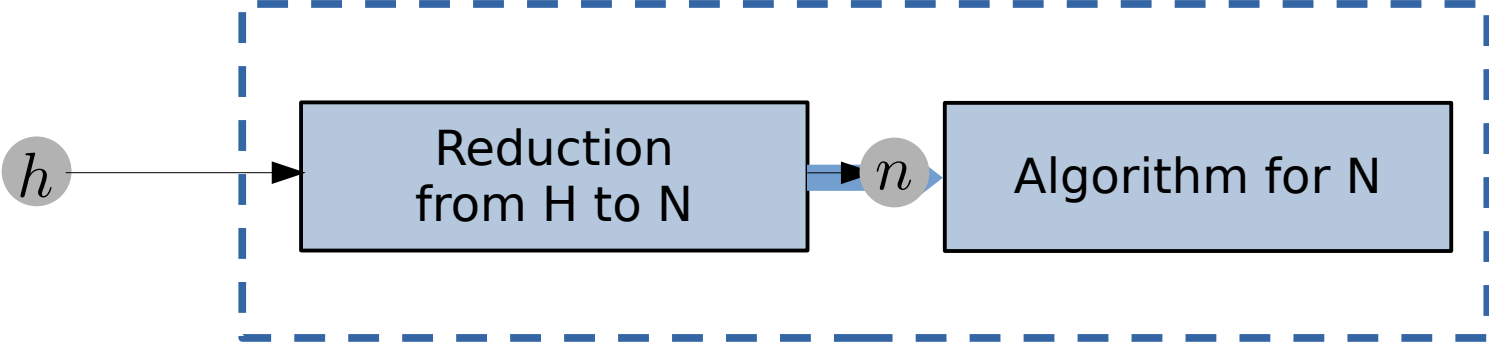
Algorithm for H

One-Call Reduction



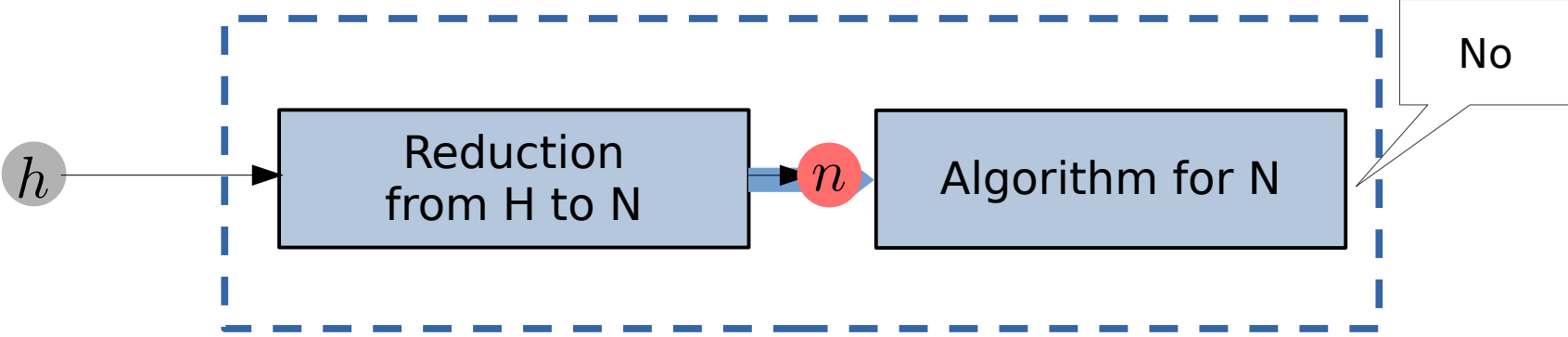
Algorithm for H

One-Call Reduction



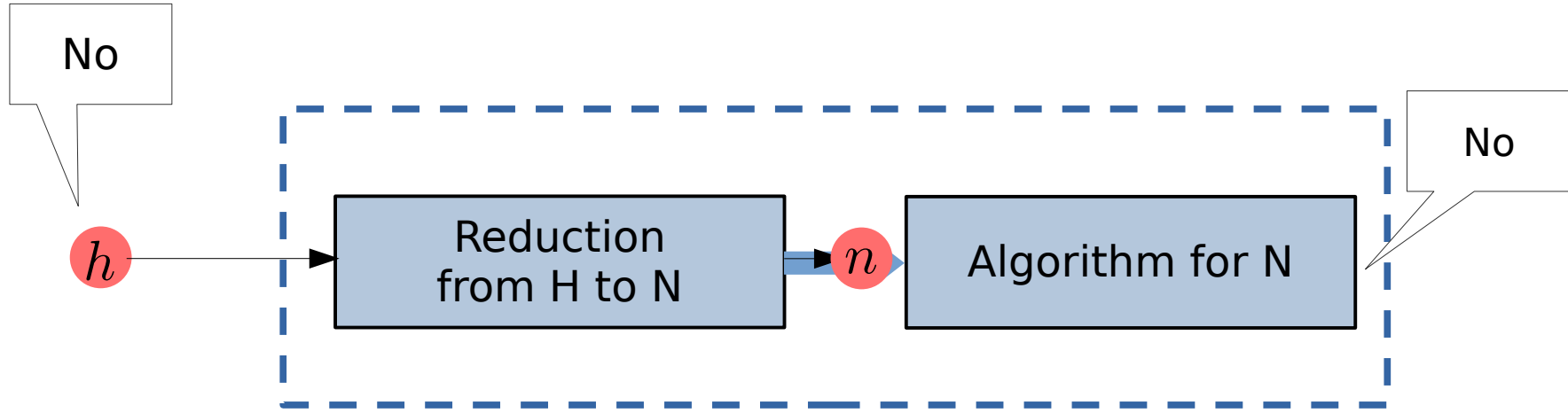
Algorithm for H

One-Call Reduction



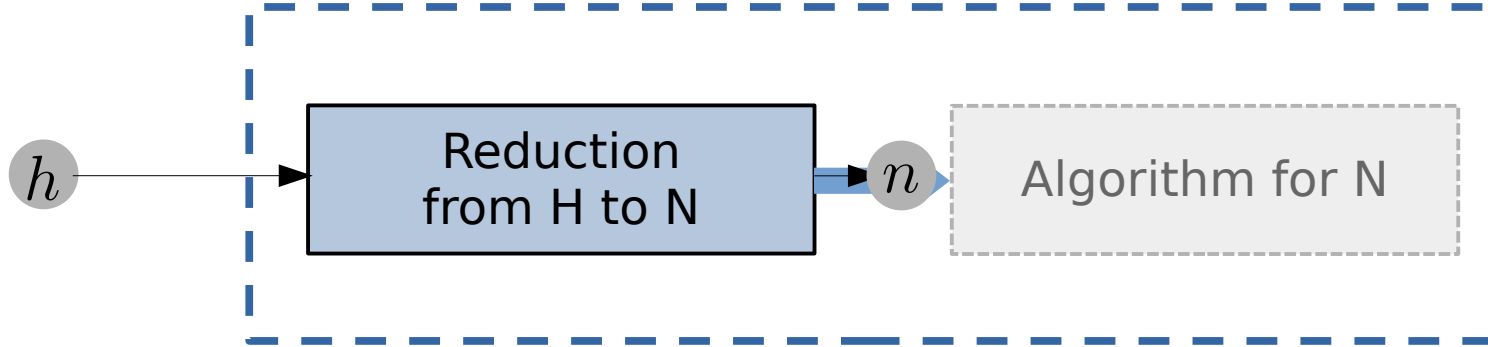
Algorithm for H

One-Call Reduction

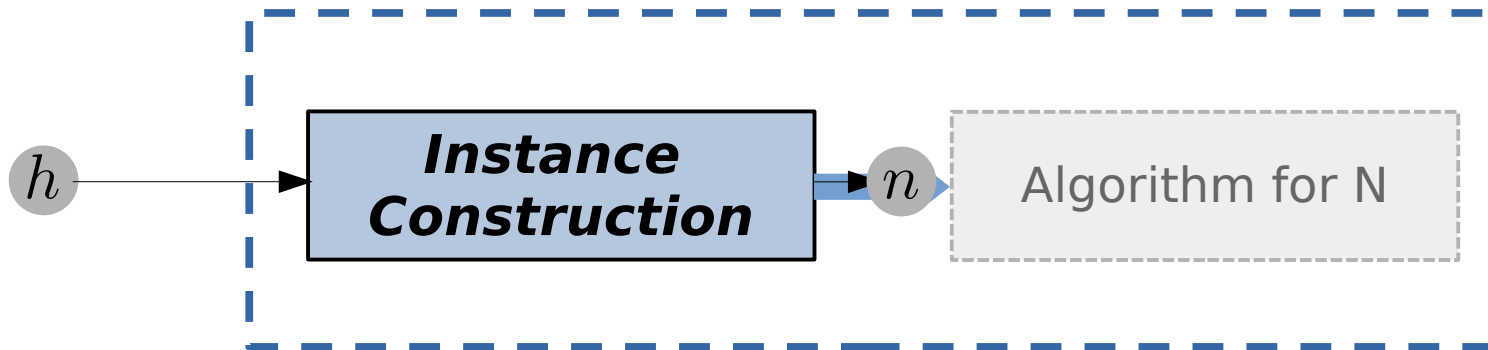


Algorithm for H

Reduction and Justifications of Correctness



Call this part “*instance construction*” from now on



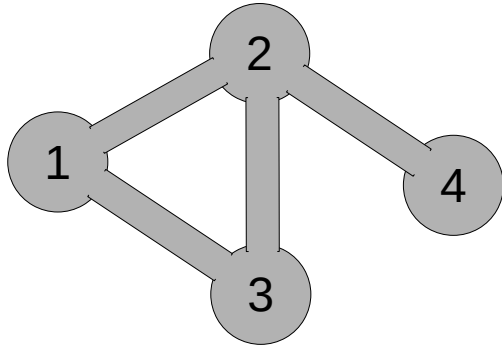
Instance Construction



VERTEX-COVER

SET-COVER

Instance Construction



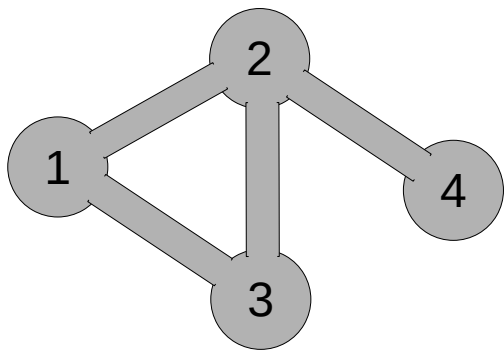
$k=2$



VERTEX-COVER

SET-COVER

Instance Construction

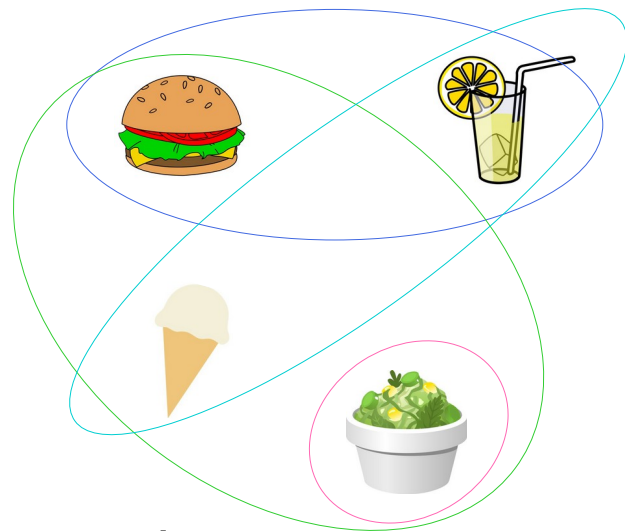


$k=2$

VERTEX-COVER



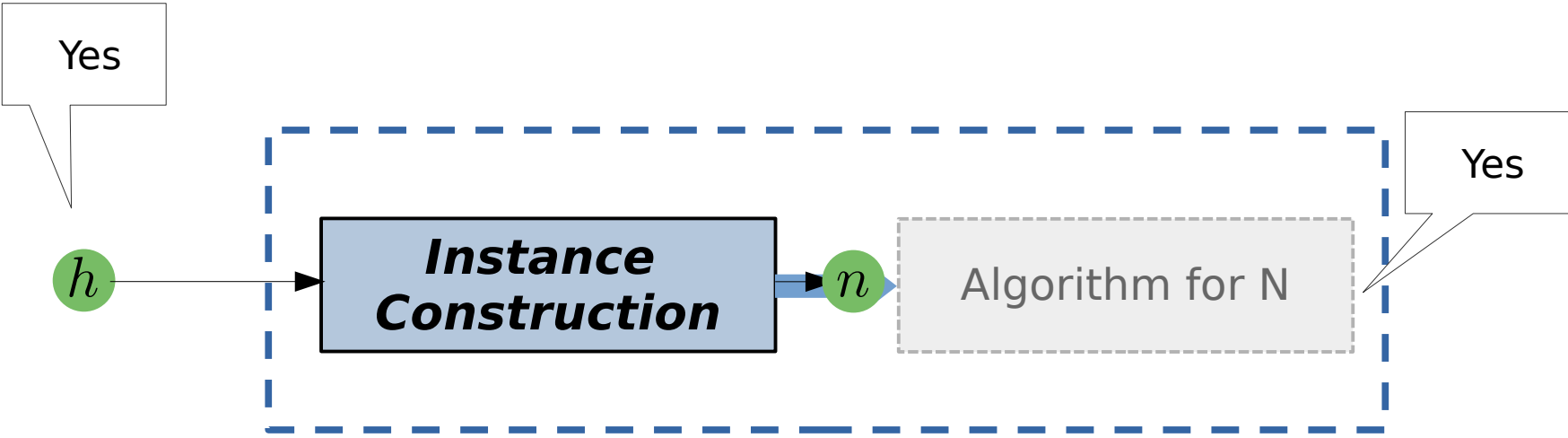
***Instance
Construction***



$k=2$

SET-COVER

Justifying N Yes \Rightarrow H Yes



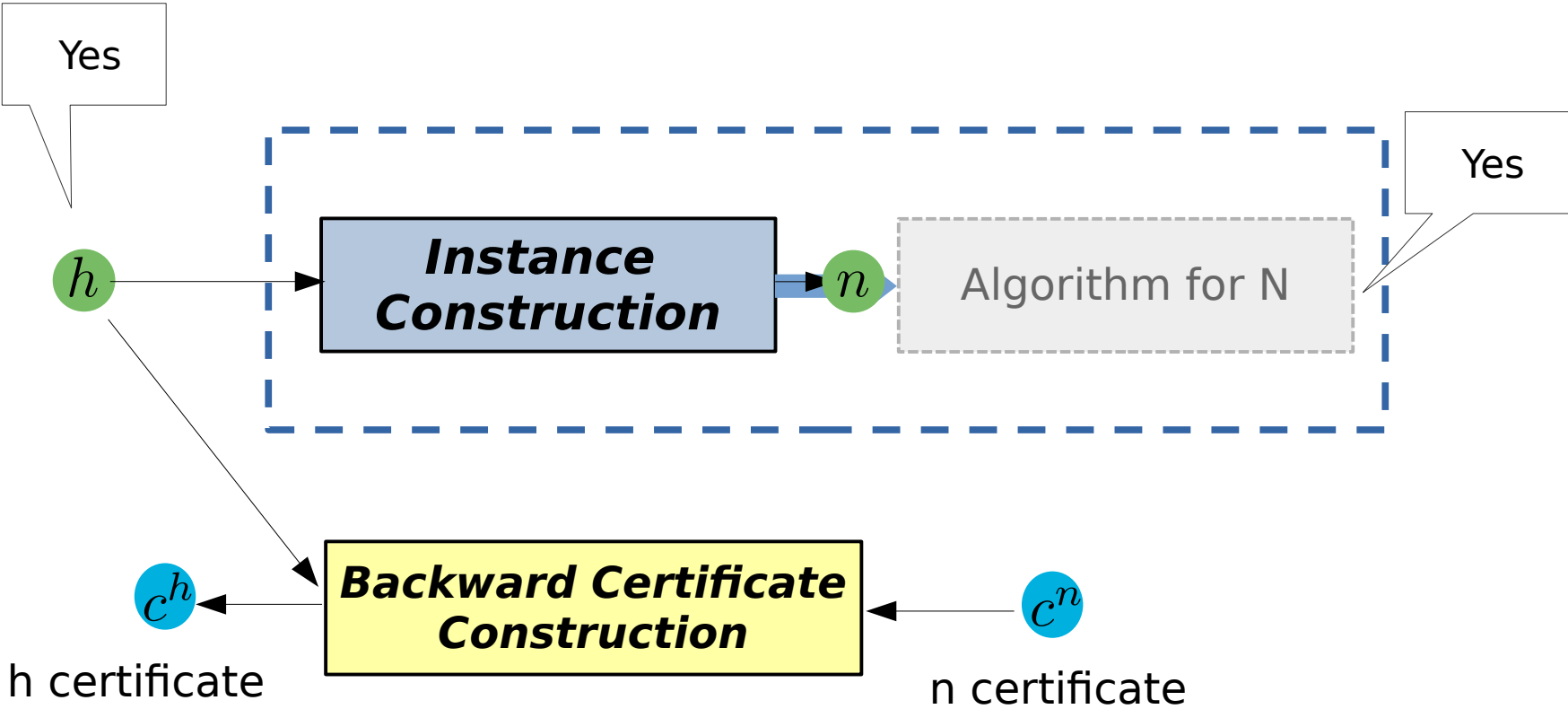
$\exists c^h$

h certificate

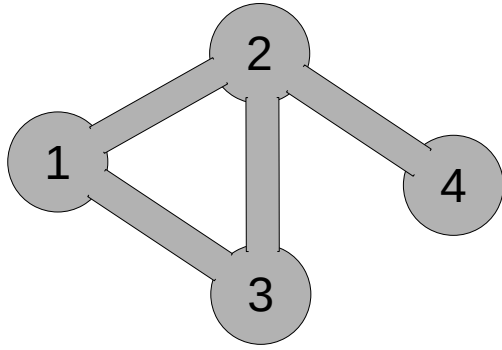
$\exists c^n$

n certificate

Justifying N Yes \Rightarrow H Yes

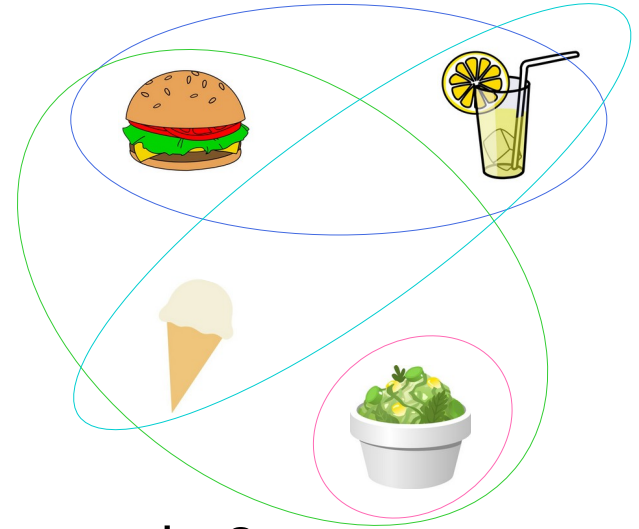


Backward Certificate Construction



$k=2$

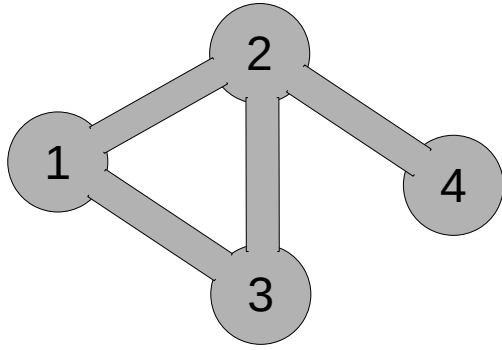
VERTEX-COVER



$k=2$

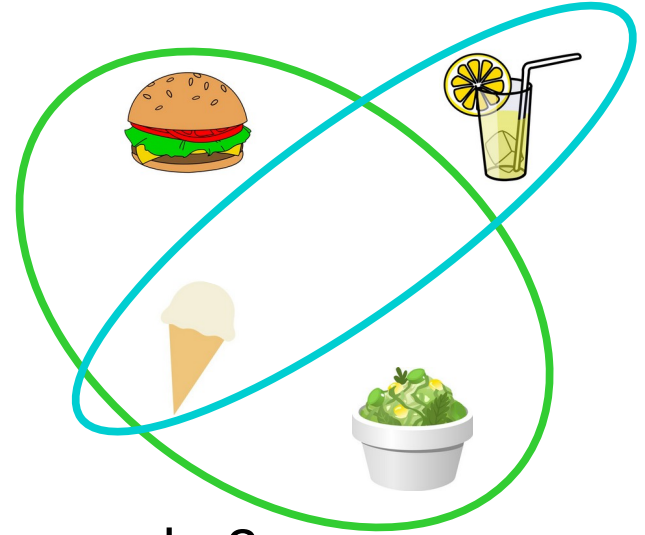
SET-COVER

Backward Certificate Construction



$k=2$

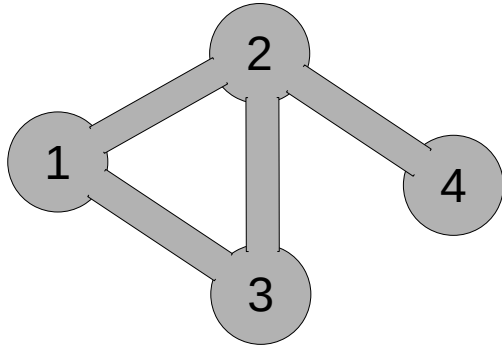
VERTEX-COVER



$k=2$

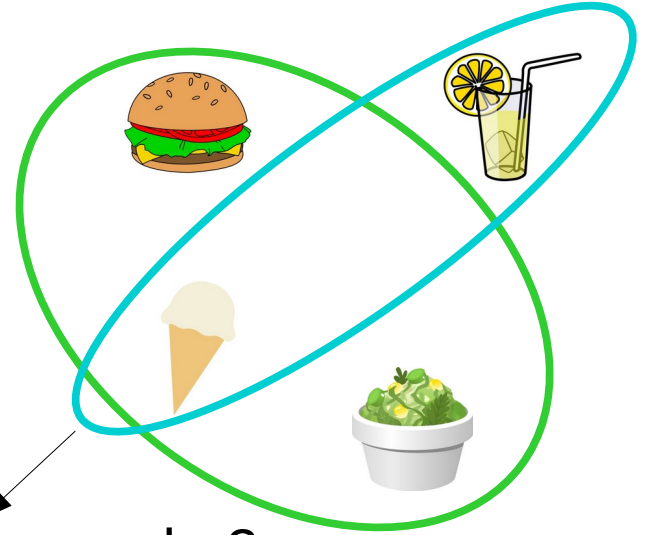
SET-COVER

Backward Certificate Construction



$k=2$

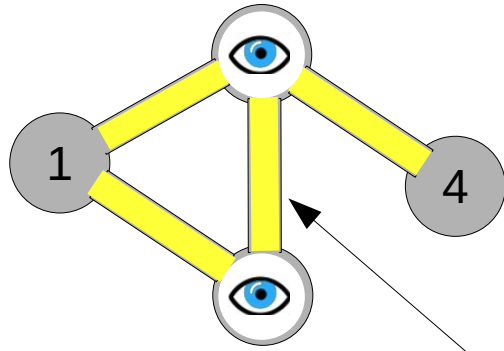
VERTEX-COVER



$k=2$

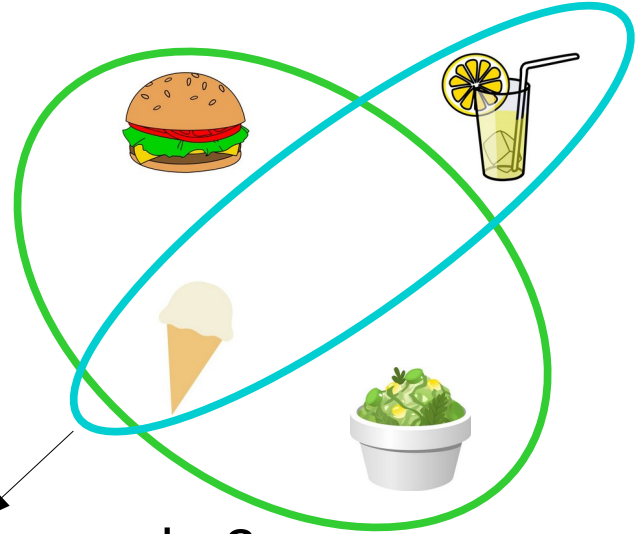
SET-COVER

Backward Certificate Construction



$k=2$

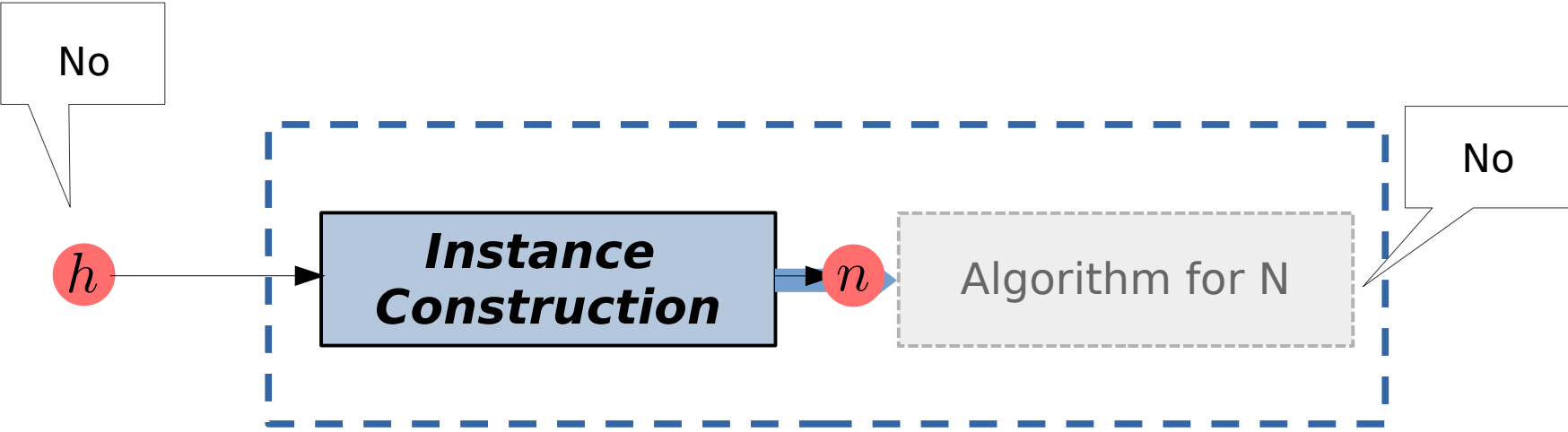
VERTEX-COVER



$k=2$

SET-COVER

Justifying N No \Rightarrow H No

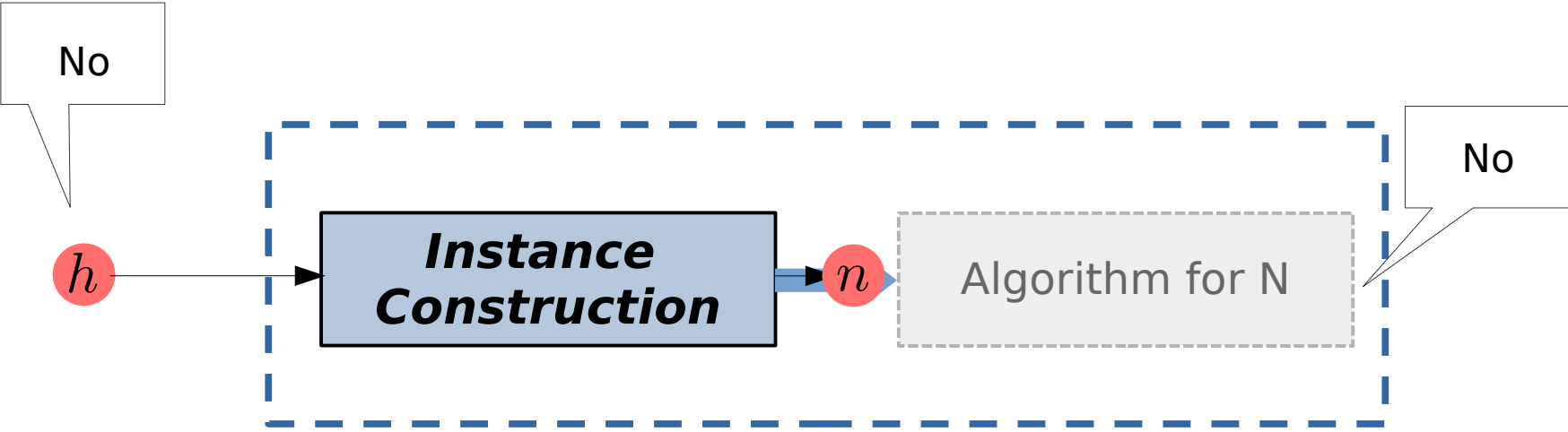


~~h-certificate~~



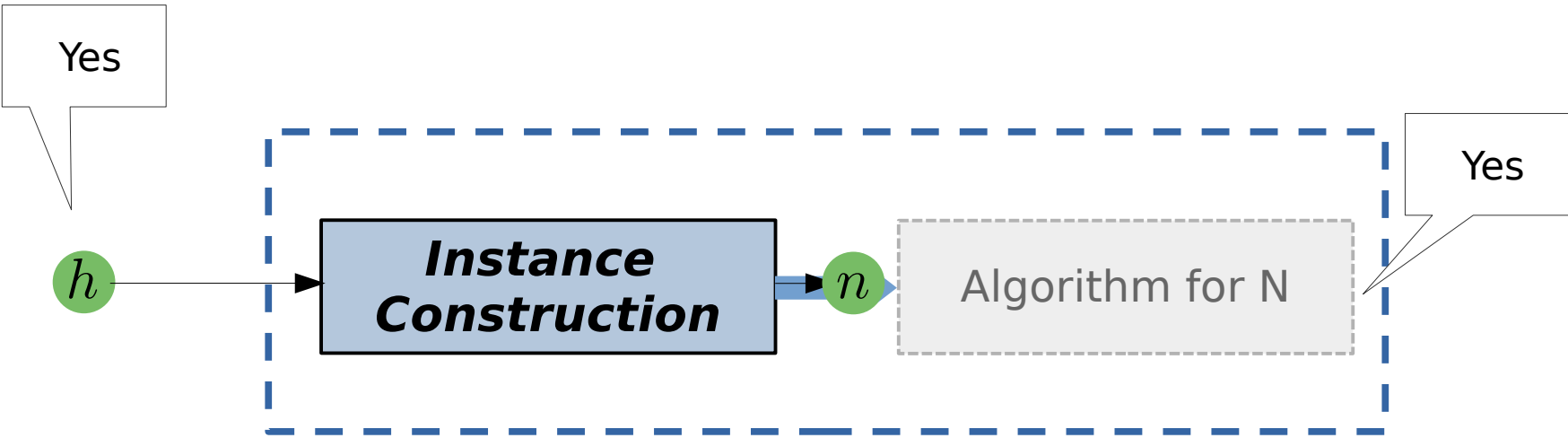
~~n-certificate~~

Justifying $N \text{ No} \Rightarrow H \text{ No}$



$$\neg \exists c^x \leftarrow \neg \exists c^y$$

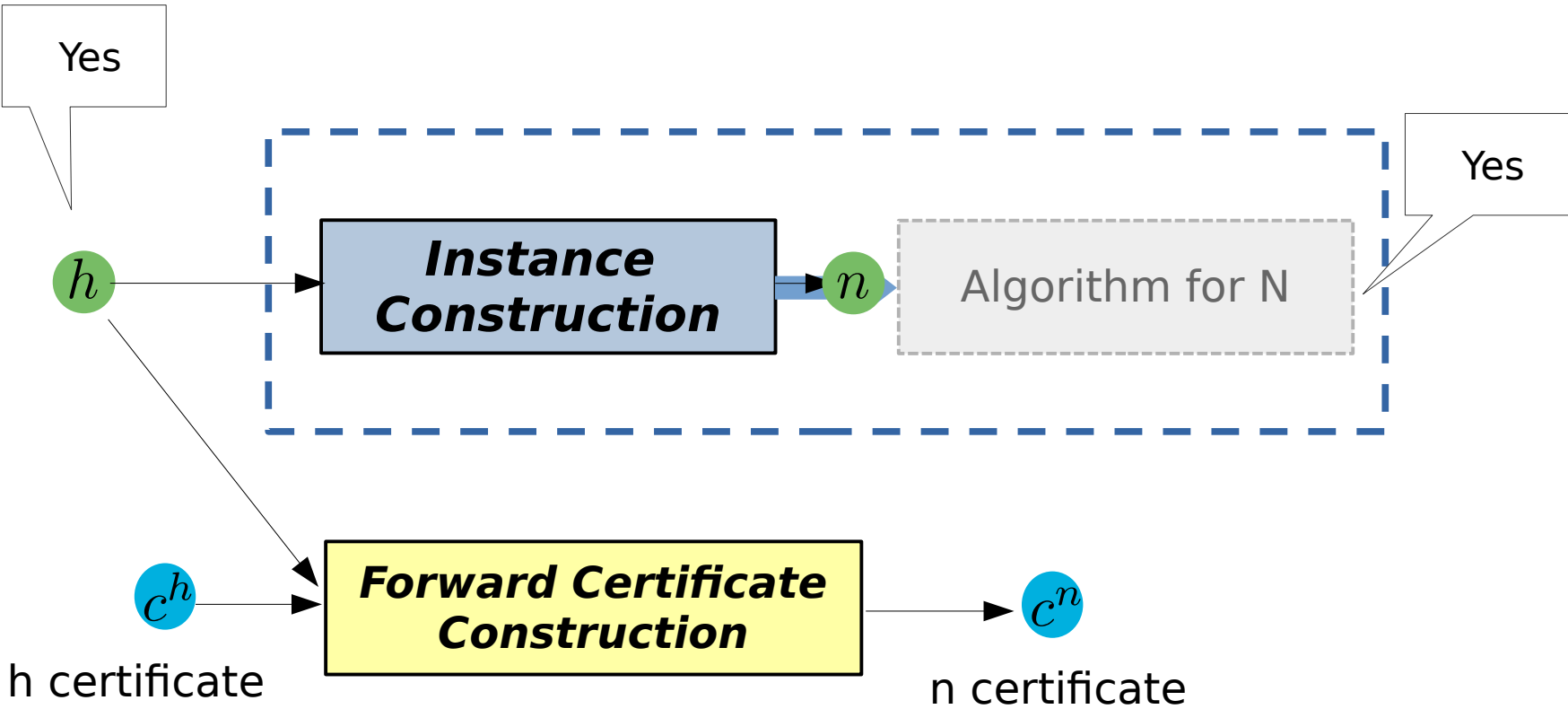
Justifying N No \Rightarrow H No



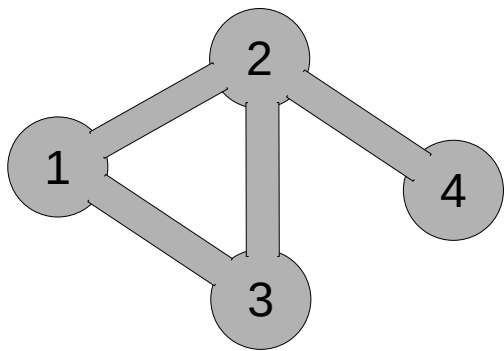
$$\exists c^x \implies \exists c^y$$

* we are in a classical world

Justifying N No \Rightarrow H No



Forward Certificate Construction

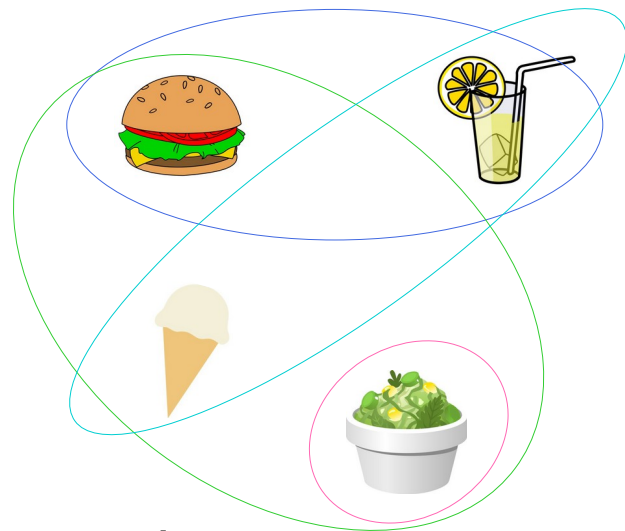


$k=2$

VERTEX-COVER

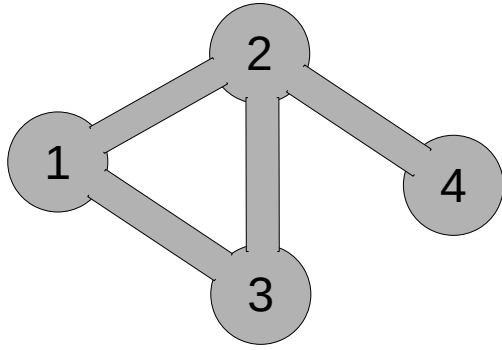


***Instance
Construction***



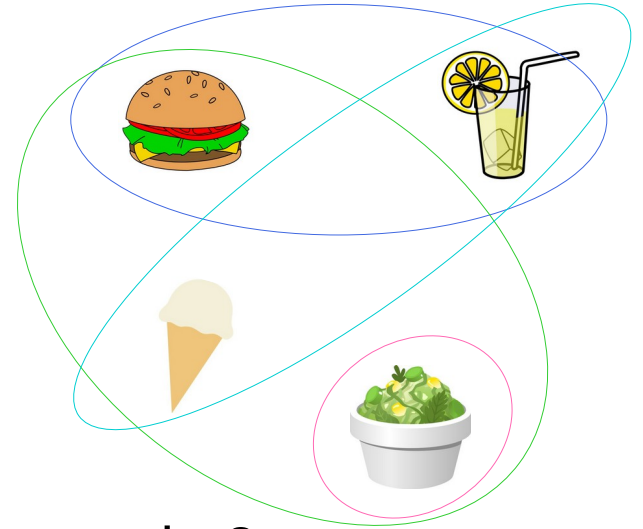
SET-COVER

Forward Certificate Construction



$k=2$

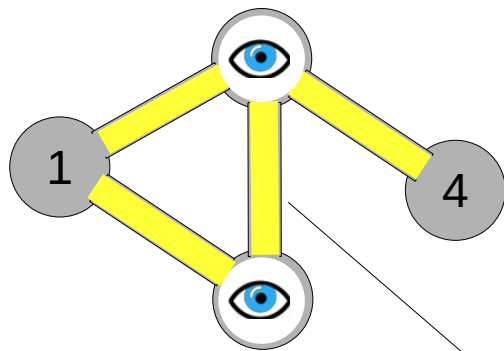
VERTEX-COVER



$k=2$

SET-COVER

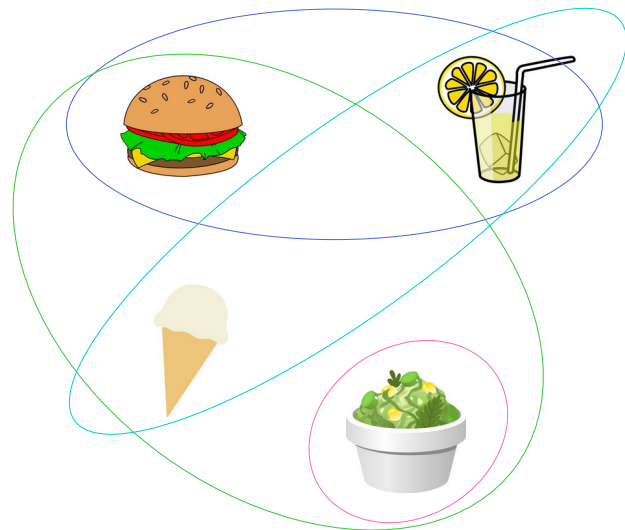
Forward Certificate Construction



$k=2$

**Instance
Construction**

**Forward Certificate
Construction**

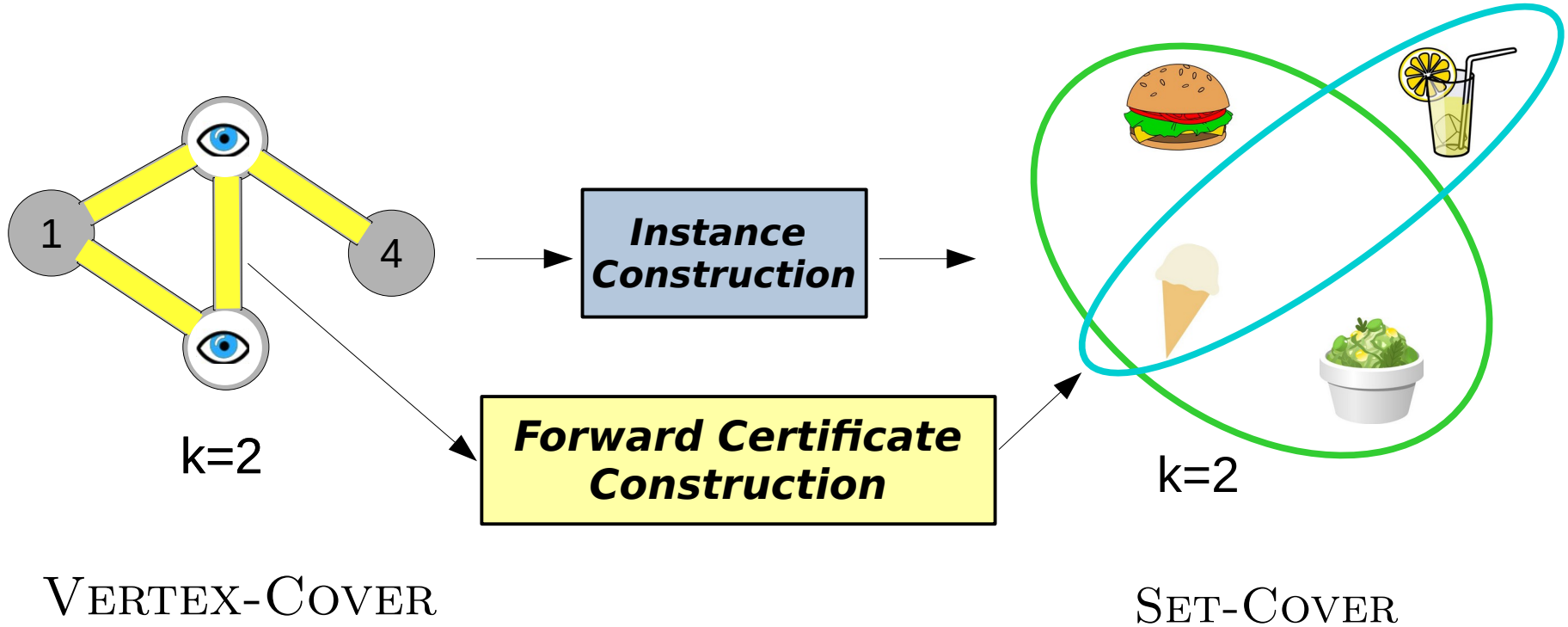


$k=2$

VERTEX-COVER

SET-COVER

Forward Certificate Construction



VERTEX-COVER

More Formally

VERTEX-COVER Instance and Certificate

Instance:

Certificate:

VERTEX-COVER Instance and Certificate

Instance: graph **G** and natural **k**

Certificate:

VERTEX-COVER Instance and Certificate

Instance: graph G and natural k

Certificate: subset of vertices of G

VERTEX-COVER Instance and Certificate

Instance: graph G and natural k

Certificate: subset of vertices of G

Assertion for valid certificate C of (G,k) :

VERTEX-COVER Instance and Certificate

Instance: graph G and natural k

Certificate: subset of vertices of G

Assertion for valid certificate C of (G,k) :

For all e in edges of G :

Exists v in C s.t. v in endpoint of e

VERTEX-COVER Instance and Certificate

Instance: graph G and natural k

Certificate: subset of vertices of G

Assertion for valid certificate C of (G,k) :

For all e in edges of G :

Exists v in C s.t. v in endpoint of e

and

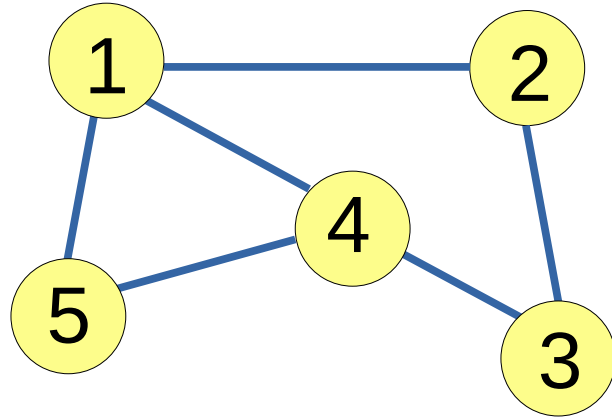
Size of $C \leq k$

Two Important Decision Problems

(we'll work with them on Wednesday)

INDEPENDENT-SET

Exists a set of k vertices s.t. no two are neighbors of each other?

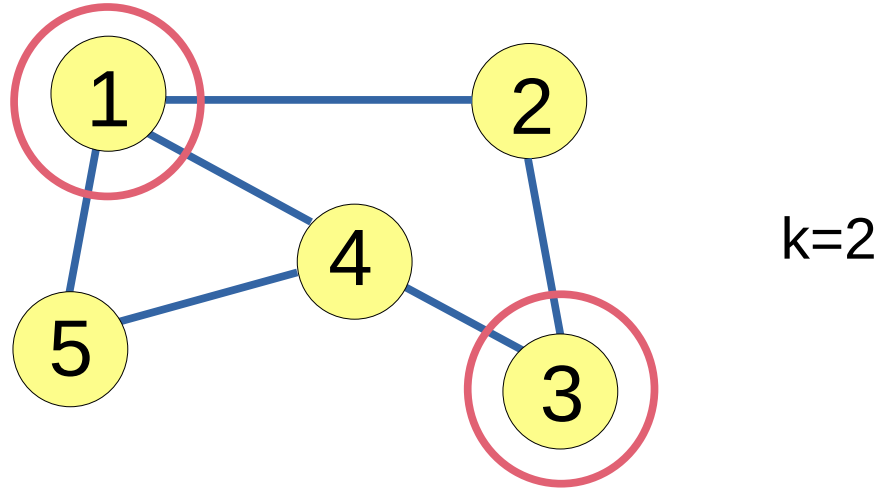


$k=2$

Instance: a graph G and a threshold number k

INDEPENDENT-SET

Exists a set of k vertices s.t. no two are neighbors of each other?

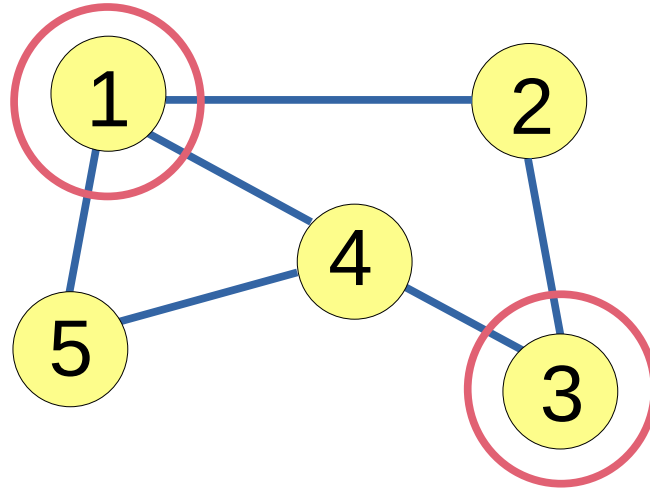


Instance: a graph G and a threshold number k

Certificate: a subset of the vertices of G

INDEPENDENT-SET

Exists a set of k vertices s.t. no two are neighbors of each other?



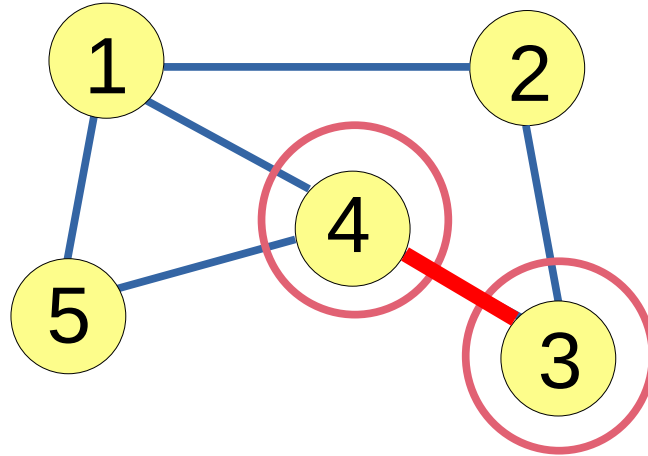
**Valid
Certificate**

Instance: a graph G and a threshold number k

Certificate: a subset of the vertices of G

INDEPENDENT-SET

Exists a set of k vertices s.t. no two are neighbors of each other?



**Invalid
Certificate**

Instance: a graph G and a threshold number k

Certificate: a subset of the vertices of G

INDEPENDENT-SET **Instance and Certificate**

INDEPENDENT-SET Instance and Certificate

Instance: graph **G** and natural **k**

INDEPENDENT-SET Instance and Certificate

Instance: graph G and natural k

Certificate: subset of vertices of G

INDEPENDENT-SET Instance and Certificate

Instance: graph G and natural k

Certificate: subset of vertices of G

Assertion for valid certificate C of (G,k) :
For all e in edges of G :

INDEPENDENT-SET Instance and Certificate

Instance: graph G and natural k

Certificate: subset of vertices of G

Assertion for valid certificate C of (G,k) :

For all e in edges of G :

Not (And one vertex of e in C

the other vertex of e in C)

INDEPENDENT-SET Instance and Certificate

Instance: graph G and natural k

Certificate: subset of vertices of G

Assertion for valid certificate C of (G,k) :

For all e in edges of G :

Not (And one vertex of e in C

the other vertex of e in C)

and

Size of $C \geq k$

3-SAT – Mother of All NP-Problems

Exists true/false assignment of the variable satisfying all clauses?

$$(\neg x_1 \vee x_2 \vee x_3)$$

$$(x_1 \vee \neg x_2 \vee x_4)$$

$$(x_2 \vee \neg x_3 \vee \neg x_4)$$

Instance: A Boolean formula in 3-conjunctive normal form (CNF)

3-SAT – Mother of All NP-Problems

Exists true/false assignment of the variable satisfying all clauses?

$$(\neg x_1 \vee x_2 \vee x_3)$$

$$(x_1 \vee \neg x_2 \vee x_4)$$

$$(x_2 \vee \neg x_3 \vee \neg x_4)$$

Valid or Not?

Instance: A Boolean formula in 3-conjunctive normal form (CNF)

$$x_1 \rightsquigarrow \text{F} \quad x_2 \rightsquigarrow \text{T} \quad x_3 \rightsquigarrow \text{F} \quad x_4 \rightsquigarrow \text{F}$$

Certificate: Assignment from variables of the CNF to Boolean

3-SAT – Mother of All NP-Problems

Exists true/false assignment of the variable satisfying all clauses?

$$(\checkmark \neg x_1 \vee x_2 \vee x_3)$$

$$(x_1 \vee \neg x_2 \vee x_4)$$

$$(x_2 \vee \neg x_3 \vee \neg x_4)$$

Valid or Not?

Instance: A Boolean formula in 3-conjunctive normal form (CNF)

$$x_1 \rightsquigarrow \text{F} \quad x_2 \rightsquigarrow \text{T} \quad x_3 \rightsquigarrow \text{F} \quad x_4 \rightsquigarrow \text{F}$$

Certificate: Assignment from variables of the CNF to Boolean

3-SAT – Mother of All NP-Problems

Exists true/false assignment of the variable satisfying all clauses?

$$(\checkmark \neg x_1 \vee x_2 \vee x_3) \checkmark$$

$$(x_1 \vee \neg x_2 \vee x_4)$$

$$(x_2 \vee \neg x_3 \vee \neg x_4)$$

Valid or Not?

Instance: A Boolean formula in 3-conjunctive normal form (CNF)

$$x_1 \rightsquigarrow \text{F} \quad x_2 \rightsquigarrow \text{T} \quad x_3 \rightsquigarrow \text{F} \quad x_4 \rightsquigarrow \text{F}$$

Certificate: Assignment from variables of the CNF to Boolean

3-SAT – Mother of All NP-Problems

Exists true/false assignment of the variable satisfying all clauses?

$$(\checkmark \neg x_1 \vee x_2 \vee x_3) \checkmark$$

$$(x_1 \vee \neg x_2 \vee x_4)$$

$$(x_2 \vee \checkmark \neg x_3 \vee \neg x_4)$$

Valid or Not?

Instance: A Boolean formula in 3-conjunctive normal form (CNF)

$$x_1 \rightsquigarrow \text{F} \quad x_2 \rightsquigarrow \text{T} \quad x_3 \rightsquigarrow \text{F} \quad x_4 \rightsquigarrow \text{F}$$

Certificate: Assignment from variables of the CNF to Boolean

3-SAT – Mother of All NP-Problems

Exists true/false assignment of the variable satisfying all clauses?

$$(\checkmark \neg x_1 \vee x_2 \vee x_3) \checkmark$$

$$(x_1 \vee \neg x_2 \vee x_4)$$

$$(x_2 \vee \checkmark \neg x_3 \vee \neg x_4) \checkmark$$

Valid or Not?

Instance: A Boolean formula in 3-conjunctive normal form (CNF)

$$x_1 \rightsquigarrow \text{F} \quad x_2 \rightsquigarrow \text{T} \quad x_3 \rightsquigarrow \text{F} \quad x_4 \rightsquigarrow \text{F}$$

Certificate: Assignment from variables of the CNF to Boolean

3-SAT – Mother of All NP-Problems

Exists true/false assignment of the variable satisfying all clauses?

$$(\checkmark \neg x_1 \vee x_2 \vee x_3) \checkmark$$

$$(\cancel{x_1} \vee \neg x_2 \vee x_4)$$

$$(x_2 \vee \checkmark \neg x_3 \vee \neg x_4) \checkmark$$

Valid or Not?

Instance: A Boolean formula in 3-conjunctive normal form (CNF)

$$x_1 \rightsquigarrow \text{F} \quad x_2 \rightsquigarrow \text{T} \quad x_3 \rightsquigarrow \text{F} \quad x_4 \rightsquigarrow \text{F}$$

Certificate: Assignment from variables of the CNF to Boolean

3-SAT – Mother of All NP-Problems

Exists true/false assignment of the variable satisfying all clauses?

$$(\checkmark \neg x_1 \vee x_2 \vee x_3) \checkmark$$

$$(\cancel{x_1} \vee \cancel{\neg x_2} \vee x_4)$$

$$(x_2 \vee \checkmark \neg x_3 \vee \neg x_4) \checkmark$$

Valid or Not?

Instance: A Boolean formula in 3-conjunctive normal form (CNF)

$$x_1 \rightsquigarrow \text{F} \quad x_2 \rightsquigarrow \text{T} \quad x_3 \rightsquigarrow \text{F} \quad x_4 \rightsquigarrow \text{F}$$

Certificate: Assignment from variables of the CNF to Boolean

3-SAT – Mother of All NP-Problems

Exists true/false assignment of the variable satisfying all clauses?

$$(\checkmark \neg x_1 \vee x_2 \vee x_3) \checkmark$$

$$(\cancel{x_1} \vee \cancel{\neg x_2} \vee \cancel{x_4})$$

$$(x_2 \vee \checkmark \neg x_3 \vee \neg x_4) \checkmark$$

**Invalid
Certificate**

Instance: A Boolean formula in 3-conjunctive normal form (CNF)

$$x_1 \rightsquigarrow \text{F} \quad x_2 \rightsquigarrow \text{T} \quad x_3 \rightsquigarrow \text{F} \quad x_4 \rightsquigarrow \text{F}$$

Certificate: Assignment from variables of the CNF to Boolean

3-SAT – Mother of All NP-Problems

Exists true/false assignment of the variable satisfying all clauses?

$$(\neg x_1 \vee x_2 \vee x_3)$$

$$(x_1 \vee \neg x_2 \vee x_4)$$

$$(x_2 \vee \neg x_3 \vee \neg x_4)$$

Valid or Not?

Instance: A Boolean formula in 3-conjunctive normal form (CNF)

$$x_1 \rightsquigarrow \text{F} \quad x_2 \rightsquigarrow \text{F} \quad x_3 \rightsquigarrow \text{F} \quad x_4 \rightsquigarrow \text{F}$$

Certificate: Assignment from variables of the CNF to Boolean

3-SAT – Mother of All NP-Problems

Exists true/false assignment of the variable satisfying all clauses?

$$(\checkmark \neg x_1 \vee x_2 \vee x_3) \checkmark$$

$$(x_1 \vee \neg x_2 \vee x_4)$$

$$(x_2 \vee \neg x_3 \vee \neg x_4)$$

Valid or Not?

Instance: A Boolean formula in 3-conjunctive normal form (CNF)

$$x_1 \rightsquigarrow \text{F} \quad x_2 \rightsquigarrow \text{F} \quad x_3 \rightsquigarrow \text{F} \quad x_4 \rightsquigarrow \text{F}$$

Certificate: Assignment from variables of the CNF to Boolean

3-SAT – Mother of All NP-Problems

Exists true/false assignment of the variable satisfying all clauses?

$$(\checkmark \neg x_1 \vee x_2 \vee x_3) \checkmark$$

$$(\cancel{x_1} \vee \checkmark \neg x_2 \vee x_4) \checkmark$$

$$(x_2 \vee \neg x_3 \vee \neg x_4)$$

Valid or Not?

Instance: A Boolean formula in 3-conjunctive normal form (CNF)

$$x_1 \rightsquigarrow \text{F} \quad x_2 \rightsquigarrow \text{F} \quad x_3 \rightsquigarrow \text{F} \quad x_4 \rightsquigarrow \text{F}$$

Certificate: Assignment from variables of the CNF to Boolean

3-SAT – Mother of All NP-Problems

Exists true/false assignment of the variable satisfying all clauses?

$$(\checkmark \neg x_1 \vee x_2 \vee x_3) \checkmark$$

$$(\cancel{x_1} \vee \checkmark \neg x_2 \vee x_4) \checkmark$$

$$(\cancel{x_2} \vee \checkmark \neg x_3 \vee \neg x_4) \checkmark$$

**Valid
Certificate**

Instance: A Boolean formula in 3-conjunctive normal form (CNF)

$$x_1 \rightsquigarrow \text{F} \quad x_2 \rightsquigarrow \text{F} \quad x_3 \rightsquigarrow \text{F} \quad x_4 \rightsquigarrow \text{F}$$

Certificate: Assignment from variables of the CNF to Boolean

3-SAT Instance and Certificate

Instance: 3CNF formula Φ

3-SAT Instance and Certificate

Instance: 3CNF formula Φ

Certificate: mapping from variables of Φ to Booleans

3-SAT Instance and Certificate

Instance: 3CNF formula Φ

Certificate: mapping from variables of Φ to Booleans

Assertion for valid certificate C of Φ :

For all c in clauses of Φ :

Exists (literal l in c s.t

l is satisfied under C)