

# Assignment Project Exam Help

Answer Set Programming<sup>1</sup>

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COMP441

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<sup>1</sup>Slides designed by Christoph Schwering

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$$\forall x (\text{Car}(x) \rightarrow \neg \text{Entry}(x))$$

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$$\forall x (\text{Car}(x) \rightarrow \neg \text{Entry}(x))$$

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$$\left. \begin{array}{l} \forall x (\text{Car}(x) \rightarrow \neg \text{Entry}(x)) \\ \forall x (\text{Car}(x) \wedge \text{Auth}(x) \rightarrow \text{Entry}(x)) \end{array} \right\} \models \text{Car}(C) \wedge \text{Auth}(C) \rightarrow \neg \text{Entry}(C)$$

## ASP at a Glance

- ASP = Answer Set Programming
  - ▶ ASP  $\neq$  Microsoft's Active Server Pages

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- ASP belongs to logic programming
  - ▶ Like Prolog: *Head*    *Body* or *Head* :- *Body*.

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- Declarative programming
  - ▶ Unlike Prolog: no procedural control
  - ▶ Order has no impact on semantics

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- ASP programs compute *models*
  - ▶ Unlike Prolog: not query-oriented, no resolution
  - ▶ Unlike Prolog: not Turing-complete
  - ▶ Tool for problems in NP and NP<sup>NP</sup>

## Motivation for ASP and this Lecture

- Very useful in practice!
  - ▶ Declarative problem solving
  - ▶ Very fast to write

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■

- ▶ Small, simple core language
- ▶ Great expressivity by reduction to core

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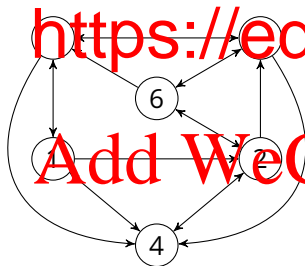
- Knowing the theory is essential

## Example: Graph Colouring

### Definition: graph colouring problem

Input: graph with vertices  $V$  and edges  $E \subseteq V \times V$ , set of colors  $C$ .

Is there a mapping  $m: V \rightarrow C$  with  $m(x) \neq m(y)$  for all  $(x, y) \in E$ ?



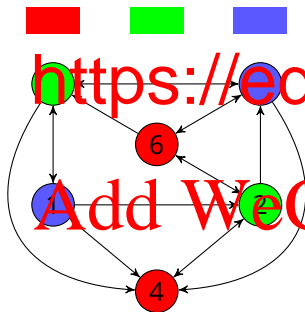


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- Graph Colouring is NP-complete

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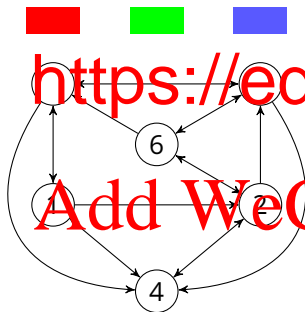
- ▶ Mapping (neighbouring countries to colors)
- ▶ Compilers (register allocation)
- ▶ Scheduling (e.g., conflicting jobs)
- ▶ Allocation problems, Sudoku, ...

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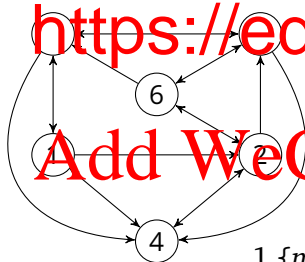
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$e(\mathbf{X}, \mathbf{Y})$

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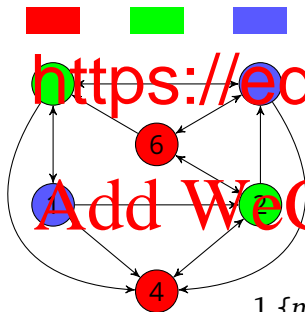
$1 \{m(X, C) : c(C)\} 1 :- v(X).$  guess mapping  $m$   
 $:- e(X, Y), m(X, C), m(Y, C).$  verify  $m(X) \neq m(Y)$

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- Automated product configuration
- Linux package manager



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- Several implementations are available
- For this lecture: **Clingo** [www.pota](http://www.pota)

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- Semantics of ASP programs

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- ASP as modeling language

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## Prolog vs ASP

Consider the following logic program:

■  $a.$

$c \leftarrow a, b.$

$d \leftarrow a, \text{not } b.$

$a.$

$c :- a, b.$

$d :- a, \text{not } b.$

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Consider the following logic program:

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- Prolog proves by SLD resolution:

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Algorithm defines what Prolog does

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- What is the *semantics* of this logic pro

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- What is the *semantics* of this logic pro

► Models:

$M_1 =$

$a$	$b$	$c$	$d$
1	0	0	1

$a$	$b$	$c$	$d$
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...

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- ▶  $M_1$  corresponds to Prolog, what is special about  $M_1$ ?



## Prolog vs ASP

Consider the following logic program:

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- ▶ Models:  $M_1 =$ 

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 ...
- ▶  $M_1$  corresponds to Prolog, what is special about  $M_1$ ?
- ▶  $M_1$  is a **stable model** a.k.a. **answer set**:  
 $M_1$  only satisfies *justified* propositions

ASP gives **semantics** to **logic programming**

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The motivating guidelines behind stable model semantics are:

- A stable model satisfies all the rules of a logic program



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Next: formalisation of this intuition

For now: only ground programs, i.e., no variables

Definition: normal logic program (NLP)

A **normal logic program**  $P$  is a set of (normal) rules of the form

$$A \leftarrow B_1, \dots, B_m, \text{not } C_1, \dots, \text{not } C_n.$$

where

When

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For such a rule  $r$ , we define:

- $\text{Head}(r) \equiv \{A\}$

- $\text{Body}(r) = \{B_1, \dots, B_m, \text{not } C_1, \dots,$

In code,  $r$  is written as  $A :- B_1, \dots, B_m, \text{not } C_1, \dots, \text{not } C_n.$

## Semantics: Interpretation

### Definition: interpretation, satisfaction

An **interpretation**  $S$  is a set of atomic propositions.

$S$  **satisfies**  $A \leftarrow B_1, \dots, B_m, \text{not } C_1, \dots, \text{not } C_n$  iff

$A$

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- $S$  falsifies body iff  $S$  falsifies some

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Ex.: Let  $P = \{a. \quad c \leftarrow a, b. \quad d \leftarrow a, \text{no}$

$S = \{a, b, c\}$  satisfies  $a$ , but it does not satisfy (not  $b$ ).



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It satisfies  $c \leftarrow a, b$  because it satisfies the head because  $c \in S$

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It satisfies  $c \leftarrow a, b$  because it satisfies the head because  $c \in S$

It satisfies  $d \leftarrow a, \text{not } b$  because it falsifies the body because  $b \in S$

## Semantics without Negation

Definition: stable model for programs without negation

For  $P$  without negated literals:

$S$  is a **stable model** of  $P$  iff

$S$  is a minimal set (w.r.t.  $\subseteq$ ) that satisfies all  $r \in P$ .

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Ex.: <https://eduassistpro.github.io>

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Theorem: unique-model property

If  $P$  is negation-free (i.e., contains no  $(\text{not } C)$ ), then there is exactly one stable model, which can be computed in linear time.



## Semantics without Negation – Examples

Compute stable model of a negation-free  $P$  by *unit propagation*:

■  $S^0 = \{\}$   
■  $S^{i+1} = S^i \cup \{r \in P : S \text{ satisfies } \text{Body}(r) \text{ Head}(r) \text{ until } S^{i+1} = S^i\}$

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Ex.:  $S^0 = \{\}$  <https://eduassistpro.github.io>

Ex.:  $P_2 = \{a \leftarrow b, b \leftarrow a\}$   
 $S^0 = \{\}$  Fixpoint Add WeChat edu\_assist\_pro

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Ex.:  $P_2 = \{a \leftarrow b. \quad b \leftarrow a.\}$   
 $S^0 = \{\}$  Fixpoint Add WeChat edu\_assist\_pro

Ex.:  $P_3 = \{a \leftarrow b. \quad b \leftarrow a. \quad a.\}$   
 $S^0 = \{\} \quad S^1 = \{a\} \quad S^2 = \{a, b\} \quad \text{Fixpoint}$

## Semantics with Negation

### Definition: reduct

The **reduct**  $P^S$  of  $P$  relative to  $S$  is the least set such that

if  $A \leftarrow B_1, \dots, B_m, \text{not } C_1, \dots, \text{not } C_n \in P$  and  $C_1, \dots, C_n \notin S$

then  $A \leftarrow B_1, \dots, B_m \in P^S$ .

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### Definition: stable model for programs with negation

For  $P$  with negated literals:

$S$  is a **stable model** of  $P$  iff  $S$  is a stable model of  $P^S$ .

## Semantics with Negation

### Definition: reduct

The **reduct**  $P^S$  of  $P$  relative to  $S$  is the least set such that  
if  $A \leftarrow B_1, \dots, B_m, \text{not } C_1, \dots, \text{not } C_n \in P$  and  $C_1, \dots, C_n \notin S$   
then  $A \leftarrow B_1, \dots, B_m \in P^S$ .

In Eng



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Ex.:  $P = \{a. \quad c \leftarrow a, b. \quad d \leftarrow a, \text{not } b.\}$

$S_1 = \{a\} \Rightarrow P^{S_1} = \{a. \quad c \leftarrow a, b.\}$

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### Definition: stable model for programs with negation

For  $P$  with negated literals:

$S$  is a **stable model** of  $P$  iff  $S$  is a stable model of  $P^S$ .

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For  $P$  with negated literals:

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Ex.:  $P = \{a \leftarrow \text{not } b. \quad b \leftarrow \text{not } a.\}$

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Ex.:  $P = \{a \leftarrow \text{not } b. \quad b \leftarrow \text{not } a.\}$   
 $S_1 = \{ \} \rightarrow P S_1 = \{ \}$

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 $S_2 = a \quad P^{S_2} =$

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## Semantics with Negation – Examples

Ex.:  $P = \{a \leftarrow \text{not } b, b \leftarrow \text{not } a.\}$

$$\delta_1 = \{\} \Rightarrow P^{\delta_1} = \{a \leftarrow \text{not} b, b \leftarrow \text{not} a.\}$$
$$S_2 = a \quad P^{S_2} = a \text{ not } b. \quad b \text{ not } a.$$
$$S_3 =$$
$$S_4 =$$

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Two s

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Ex.:  $P = \{a \leftarrow \text{not } a.\}$

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No stable model!

## Semantics: Overview

### Definition: reduct

The **reduct**  $P^S$  of  $P$  relative to  $S$  is the least set such that  
if  $A \leftarrow B_1, \dots, B_m, \text{not } C_1, \dots, \text{not } C_n \in P$  and  $C_1, \dots, C_n \notin S$   
then  $A \leftarrow B_1, \dots, B_m \in P^S$ .

### Defi

If  $P \subseteq S$   
 $S$  is a

$S$  is a minimal set (w.r.t.  $\subseteq$ ) that satis

If  $P$  contains  $(\text{not } C)$ .

$S$  is a **stable model** of  $P$  iff  $S$  is a stable m

### Theorem: necessary satisfaction condition

If  $S$  is a stable model and  $A \in S$ ,  
then  $S$  satisfies some  $r \in P$  with  $A \in \text{Head}(r)$ .

## Semantics – Examples

Ex.:  $P = \{a \leftarrow a. \quad b \leftarrow \text{not } a.\}$

$S$

$P^S$

Stable model?

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Ex.:

$S$

$P^S$

el?

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Example on paper

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- Semantics of ASP programs



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- ASP as modeling language

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## Integrity Constraints

### Definition: integrity constraint

An **integrity constraint** is a rule  $r$  of the form

$$\leftarrow B_1, \dots, B_m, \text{not } C_1, \dots, \text{not } C_n$$

$S$  **satisfies**  $r$  iff some  $B_i \not\models S$  or some  $C_j \models S$ .

$P^S \subseteq$

$n \notin S$ .

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# Integrity Constraints

## Definition: integrity constraint

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$P \models c$

$n \notin S$ .

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## The

Let  $P'$  be like  $P$  except that every integrity  $c$

$$\leftarrow B_1, \dots, B_m, \text{not } C_1$$

is replaced with

$$\text{dummy} \leftarrow B_1, \dots, B_m, \text{not } C_1, \dots, \text{not } C_n, \text{not dummy}$$

for some new atom *dummy*.

Then  $P$  and  $P'$  have the same stable models.

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## Choice Rules

### Definition: choice rule

A **choice rule** is a rule the form

$\{A_1, \dots, A_k\} \leftarrow B_1, \dots, B_m, \text{not } C_1, \dots, \text{not } C_n$   
which allows any subset of  $\{A_1, \dots, A_k\}$  in a stable model.

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The

A choi  
new atoms.

$2k + 1$

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The

A choi

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$2k + 1$

Further extensions:

- Conditional literals:  $\{A : B\}$

Ex.:  $\{m(v, C) : c(C)\}$  expands to  $\{m(v, r), m(v, g), m(v, b)\}$

- Cardinality constraints:  $\min \{A_1, \dots, A_k\} \max$

Ex.:  $1 \{m(v, r), m(v, g), m(v, b)\} 1$

## Negation in the Rule Head

Definition: rules with negated head

A rule with **negated head** is of the form

$\text{not } A \leftarrow B_1, \dots, B_n, \text{not } C_1, \dots, \text{not } C_k$

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$$\text{not } A \leftarrow B_1, \dots, B_m, \text{not } C_1, \dots, \text{not } C_n$$

The

Let  $P$

is replaced with

and

$$\leftarrow B_1, \dots, B_m, \text{not } C_1, \dots$$

$$\text{dummy} \leftarrow \text{not } A$$

for some new atom *dummy*.

Then  $P$  and  $P'$  have the same stable models (modulo dummy propositions).

## Complexity

Theorem: complexity of NLPs without negations

Is  $S$  a stable model of a negation-free  $P$ ? – **Linear time**

Does a negation-free  $P$  have a stable model? – **Constant** (yes, one)

The

Is  $S$  a stable model of  $P$ ? – **Linear time**

Does  $P$  have a stable model? – **NP-co**

Note: integrity constraints, choice rules, negation in heads  
**preserve complexity** (program grows only polynomially)

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- Semantics of ASP programs



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- ASP as modeling language

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## Programs with Variables

- Atomic propositions may now contain variables, e.g.,

$$p(X, Z) \leftarrow \neg e(X, Y), p(Y, Z)$$

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## Programs with Variables

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## Programs with Variables

- Atomic propositions may now contain variables, e.g.,

$$p(X, Z) \leftarrow e(X, Y), p(Y, Z)$$



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- ASP **grounds** variables with Herbra

- ▶ Unlike Prolog: instantiation instead

- ▶ Caution: the ground program may grow

- ▶ Caution: function symbols make grounding Turing-complete

- ▶ If  $P$  is finite and mentions only constants, grounding is finite

## Programs with Variables

■  $f(X) \leftarrow b(X), \text{not } a(X).$

$a(X) \leftarrow p(X).$

$b(\text{sam}).$

$b(\text{tweety}).$

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■ <https://eduassistpro.github.io>

$f(\text{tweety}) \leftarrow b(\text{tweety}), \text{not } a(\text{tweety}).$

$a(\text{sam}) \leftarrow p(\text{sam}).$

$a(\text{tweety}) \leftarrow p(\text{tweety}).$

$b(\text{sam}).$

$b(\text{tweety}).$

$p(\text{tweety}).$

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# Assignment Project Exam Help

- Semantics of ASP programs



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- ASP as modelling language

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## ASP Modelling

Typical ASP structure:

- Problem **instance**: a set of facts
- Problem **class**: a set of rules

$c(r). \ c(g). \ c(b).$   
 $v(1). \ \dots \ v(6).$   
 $e(1,2). \ e(1,3). \ e(1,4).$   
 $e(2,4). \ e(2,5). \ e(2,6).$   
 $e(3,1). \ e(3,4). \ e(3,5).$   
 $e(4,1). \ e(4,2).$   
 $e(5,3). \ e(5,4).$   
 $e(6,2). \ e(6,3). \ e(6,5).$

$1 \ \{m$

$:- v(X).$

$m(r,c).$

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Ideal modeling is **uniform**: problem class instances

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Semantically equivalent encodings may differ immensely in performance!

## Example: Non-monotonic Reasoning

Tweety the penguin:

- (Normal) Birds fly.
- Penguins are abnormal.
- Tweety is a bird. So Tweety flies.



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## Example: Non-monotonic Reasoning

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$U =$  <https://eduassistpro.github.io>  
 $P = \{ () \leftarrow (), \quad (). \quad () \leftarrow (). \quad ().$

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$U =$  <https://eduassistpro.github.io>  
 $P = \{ \text{ } \leftarrow \text{ }, \text{ } \cdot \text{ } \leftarrow \text{ } \cdot \text{ } \}$

$S_1 = \{b(t), f(t)\} \Rightarrow P^{S_1} = \{f(t) \leftarrow b(t)\}$  ✓  
 $S_2 = \{a(t), b(t), p(t)\} \Rightarrow P^{S_2} = \{f(t) \leftarrow b(t)\}$  ✗  
Tweety flies!

## Example: Non-monotonic Reasoning

Tweety the penguin:

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- 

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$U =$  <https://eduassistpro.github.io>  
 $P = \{ \text{bird}(t) \leftarrow \text{penguin}(t), \text{fly}(t) \leftarrow \text{bird}(t) \}$

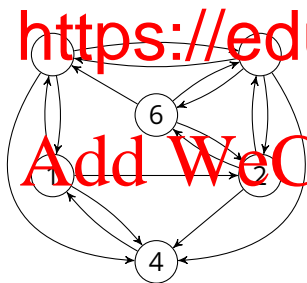
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 $S_2 = \{a(t), b(t), p(t)\} \Rightarrow P^{S_2} = \{f(t) \leftarrow b(t)\}$  ✗  
Tweety flies!

$S_1 = \{b(t), f(t)\} \Rightarrow (P \cup \{p(t).\})^{S_1} = P_2^{S_1} \cup \{p(t).\}$  ✗  
 $S_2 = \{a(t), b(t), p(t)\} \Rightarrow (P \cup \{p(t).\})^{S_2} = P_2^{S_1} \cup \{p(t).\}$  ✓  
Tweety doesn't fly.

## Example: Hamilton Cycle

Definition: Hamilton cycle problem

Input: graph with vertex set  $V$  and edges  $E \subseteq V \times V$ .  
Is there a cycle that visits every vertex exactly once?



$r(Y)$

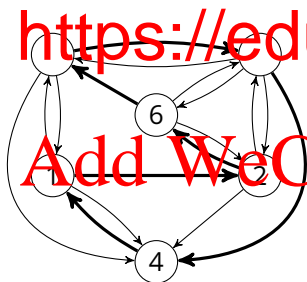
$\leftarrow \frac{2}{2}$

$\leftarrow \text{no } ( ), ( )$ .

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Definition: Hamilton cycle problem

Input: graph with vertex set  $V$  and edges  $E \subseteq V \times V$ .  
Is there a cycle that visits every vertex exactly once?



$r(Y)$

$\leftarrow \frac{2}{2}$

$\leftarrow \text{no } ( ), ( )$ .

## Example: $N$ -Queens

Definition:  $N$ -queens problem

Place  $N$  queens on a  $N \times N$  chessboard so that they do not attack each other, i.e., share no row, column, or diagonal.

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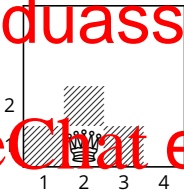


Program on paper

## Example: $N$ -Queens

Definition:  $N$ -queens problem

Place  $N$  queens on a  $N \times N$  chessboard so that they do not attack each other, i.e., share no row, column, or diagonal.



Program on paper