

# Knowledge Representation

## Lecture 7: Non-monotonic Reasoning and Default Logic

Atefeh Keshavarzi

17, November 2023

# Human Reasoning



# Human Reasoning



- ▶ Tweety is a bird.
- ▶ Does Tweety Fly?

# Human Reasoning



- ▶ Tweety is a bird.
- ▶ Does Tweety Fly?
- ▶ Tweety is a penguin.
- ▶ Does Tweety Fly?



- ▶ Birds can fly! Then, Tweety can fly.

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- ▶ Tweety is a bird.
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- ▶ Does Tweety Fly?
- ▶ You are not a logical person!



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- ▶ WHY?

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- ▶ Does Tweety Fly?
- ▶ You are not a logical person!
- ▶ Contradiction!



- ▶ Birds can fly! Then, Tweety can fly.
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- ▶ WHY?

## Flashback: First-Order Logic

We can use first-order logic to model the parcel example a bit better:

$\neg \text{AtHome}(\text{patrick})$

$\text{DeliversParcelTo}(\text{mailMan}, \text{patrick}, \text{parcel})$

$\text{Neighbour}(\text{patrick}, \text{lucia})$

$\forall x : \forall y : (\exists z : \text{DeliversParcelTo}(z, y, x) \wedge \text{AtHome}(x)) \rightarrow \text{ReceivesParcel}(x, y))$

$\vdots$

# Human Reasoning



- ▶ **Tweety is a bird. Does Tweety fly?**
- ▶  $\text{Bird}(x)$ :  $x$  is a bird.
- ▶  $\text{Fly}(x)$ :  $x$  flies.
- ▶  $\forall x : (\text{Bird}(x) \rightarrow \text{Fly}(x))$
- ▶  $\text{Bird}(\text{tweety}) \rightarrow \text{Fly}(\text{tweety})$



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- ▶ **Fly(tweety)**

# Human Reasoning



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▶  $\text{Fly}(\text{tweety})$

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- ▶ **Contradiction! Don't you believe in logic?**



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- ▶ **Contradiction! Don't you believe in logic?**



- ▶  $\text{Fly}(\text{tweety})$
- ▶  $\neg \text{Fly}(\text{tweety})$
- ▶ WHY?

# Human Reasoning

What are your thoughts on the previous discussion?

1. Mary is characterized as an irrational person.
2. Mary should not change her mind about Tweety flying, even after realizing it is a penguin.
3. Mary should delay answering Ali's first question until she is certain about Tweety's ability to fly.
4. Classical logic is not a suitable formalism for representing human reasoning.



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# An Automated Train System

Is propositional logic appropriate to model exception?

The train operates smoothly unless a train sensor detects an obstacle, in which case it must come to a stop.



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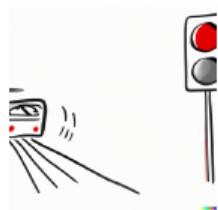
## Option 1

- ▶ train
- ▶ train → goes
- ▶ train  $\wedge$  obstacle → stops
- ▶ obstacle
- ▶ stops  $\rightarrow$   $\neg$ goes

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- ▶ stops →  $\neg$ goes
- ▶ inconsistent!

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- ▶  $\text{train} \rightarrow \text{goes}$
- ▶  $\text{train} \wedge \text{obstacle} \rightarrow \text{stops}$
- ▶ obstacle
- ▶  $\text{stops} \rightarrow \neg \text{goes}$
- ▶ **inconsistent!**

## Option 2

- ▶ train
- ▶  $\text{train} \wedge \neg \text{obstacle} \rightarrow \text{goes}$
- ▶  $\text{train} \wedge \text{obstacle} \rightarrow \text{stop}$

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- ▶  $\text{train} \wedge \neg \text{obstacle} \rightarrow \text{goes}$
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- ▶ **it does not go!**

# Outline

## Reasoning is often Defeasible

Monotonic vs. Non-monotonic Reasoning

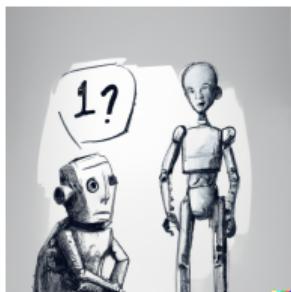
Why is standard logic not suitable?

Default Logic

Syntax

Semantics

# Decision-Making under Uncertainty



Knowledge is often incomplete and uncertain, so agents

- ▶ Draw tentative conclusions based on **available evidence**;
- ▶ **Revise** conclusions when new evidence **contradicts** previous **assumptions**.

This type of reasoning is defeasible and **non-monotonic logics** capture the logic of **defeasible reasoning**.

# Defeasible Reasoning: AI System for Diagnosing COVID-19

## Example

- ▶ Rule: symptoms such as fever, cough, and difficulty breathing, likely to have COVID-19.
- ▶ Exception: a negative COVID-19 test result, the flu.

## What is a system decision?

1. Initial knowledge: Alice has the symptoms, and **no test result**.

Initial Knowledge

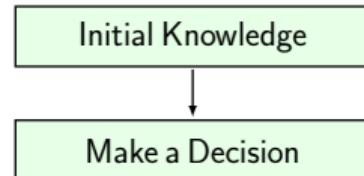
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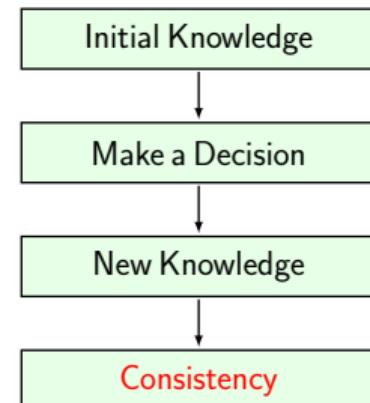
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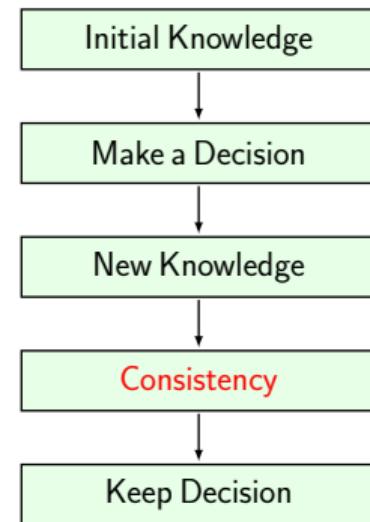
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2. Apply the **rule**: Alice is **likely** to have COVID-19.
3. New knowledge: Alice gets a **positive** test result.
4. Keep decision: Alice has COVID-19



# Defeasible Reasoning: AI System Diagnostic Reasoning

## Example

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- ▶ Exception: a negative COVID-19 test result, the flu.

## What is a system decision?

1. Initial knowledge: Bob has the symptoms, and a **negative** test result.

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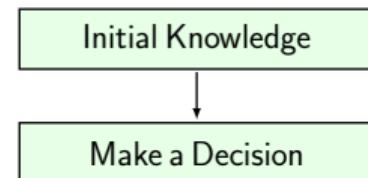
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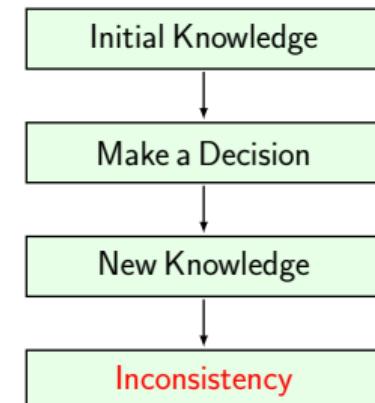
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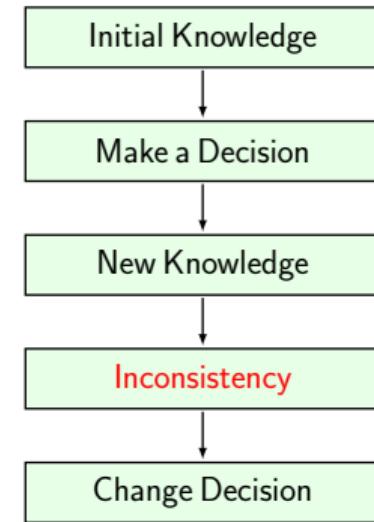
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2. Apply the **exception**: Bob is likely not to have COVID-19, but the flu.
3. New knowledge: Bob gets a second test result that is **positive**.
4. Retracting the previous conclusion and applying the rule: Bob has COVID-19.



# Outline

Reasoning is often Defeasible

## Monotonic vs. Non-monotonic Reasoning

Why is standard logic not suitable?

Default Logic

Syntax

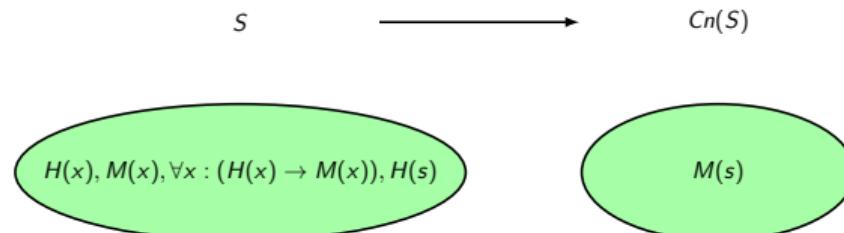
Semantics

# Monotonic Reasoning

## Example

All humans are mortal. Socrates is a human.

- ▶  $H(x) : x \text{ is human.}$
- ▶  $M(x) : x \text{ is mortal.}$
- ▶  $\forall x : (H(x) \rightarrow M(x))$ : All humans are mortal.
- ▶  $H(s) : \text{Socrates is a human.}$
- ▶ **Entailment:**  $M(s)$ .

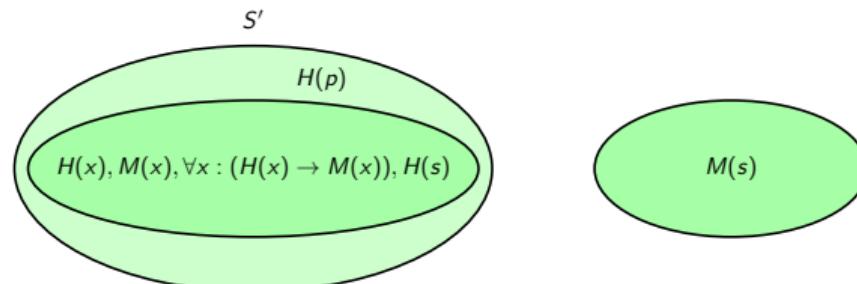


# Monotonic Reasoning

## Example

All humans are mortal. Socrates is a human. Plato is a human.

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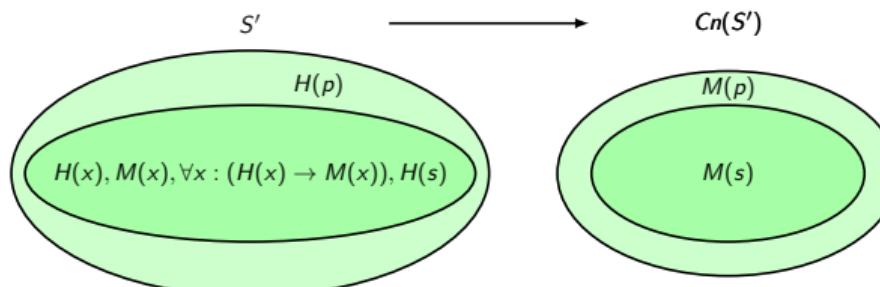


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- ▶  $H(p) : \text{Plato is a human.}$
- ▶ **Entailment:**  $M(s), M(p)$ .



## Which of the following sentences implies the notion of monotonic reasoning?

Monotonic reasoning means:

- ▶ the more information I have, the less I can derive, with the extreme case in which I cannot derive anything.
- ▶ the more information I have, the more I can derive, with the extreme case of an inconsistency in which I cannot derive anything.
- ▶ the more information I have, the more I can derive, with the extreme case of an inconsistency in which I can derive everything.

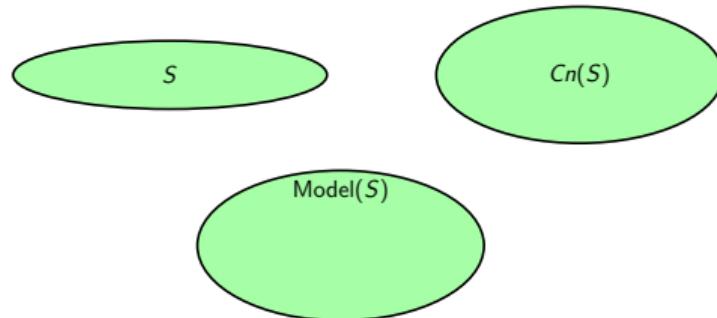


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# Monotonic Reasoning

## Definition

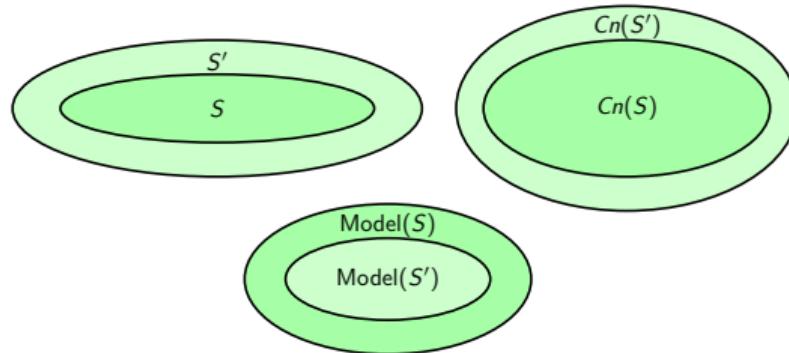
A logic  $L$  is **monotonic** iff for any sets of formula  $S$  and  $S'$  it holds that if  $S \subseteq S'$  then  $Cn(S) \subseteq Cn(S')$ , where  $Cn(S) = \{ \phi \mid S \models_L \phi \}$



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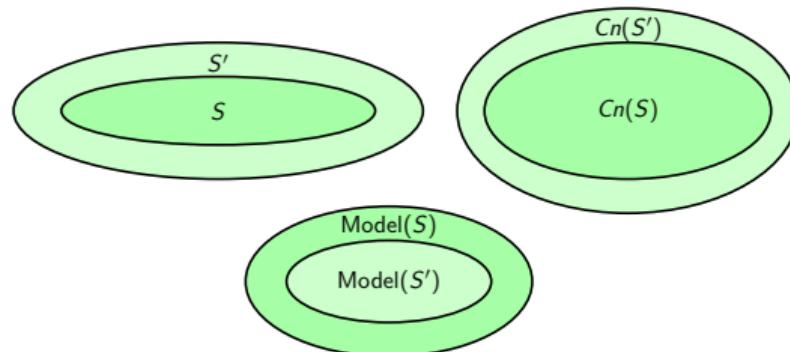
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## Monotonic Reasoning

More information

$\implies$  More entailments

$\implies$  Less models

- ▶ Propositional logic is monotonic
- ▶ First-order logic is monotonic.

# Reasoning

- ▶ Deriving logical conclusion and making predictions from available knowledge, facts, and beliefs
  - ▶ **Monotonic Reasoning:** The more you know, the more is entailed.
  - ▶ **Non-monotonic Reasoning:** Some conclusions may be invalidated if we add some more information to our knowledge base.

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Birds normally can fly. Tweety is a bird.

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Birds normally can fly. Tweety is a bird.

- ▶ Conclusion: Tweety can fly

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Birds normally can fly. Tweety is a bird.

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Tweety is a penguin.

**Exception:** Penguin cannot fly!

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## Example

Birds normally can fly. Tweety is a bird.

- ▶ Conclusion: Tweety can fly

Tweety is a penguin.

**Exception:** Penguin cannot fly!

- ▶ New information cause a revision of previous conclusions
- ▶ Conclusion: Tweety cannot fly

## Advantage of Non-monotonic Reasoning

- ▶ For real-world scenarios containing **exceptions**, such as Robot navigation, we can use non-monotonic reasoning

## Flashback: Human Reasoning



- ▶ How did you use FOL for **non-monotonic reasoning**?
- ▶ Your example was an instance of **defeasible reasoning**.

## Flashback: Human Reasoning



- ▶ Here is my formalism.



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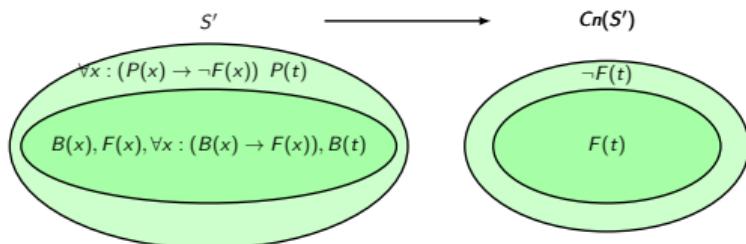
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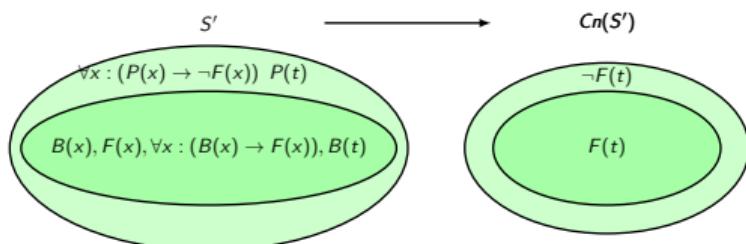
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- ▶ Here is my formalism.



- ▶ How did you use FOL for **non-monotonic reasoning**?
- ▶ Your example was an instance of **defeasible reasoning**.
- ▶ You are not **allowed** to use FOL for non-monotonic reasoning.
- ▶ I revised conclusions when new evidence contradicts previous assumptions.



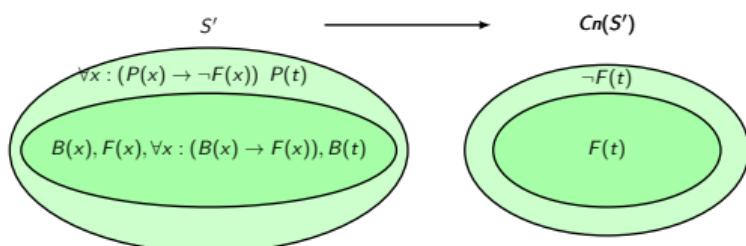
# Flashback: Human Reasoning



- ▶ Here is my formalism.
- ▶ Is there a formalism to represent non-monotonic reasoning?



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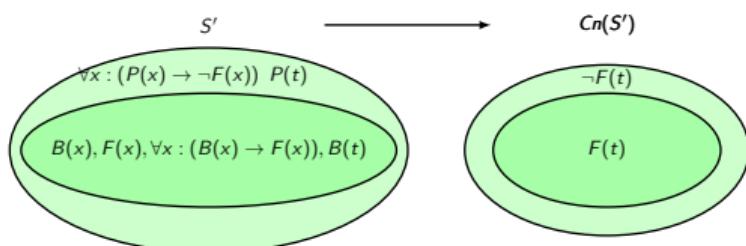
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- ▶ Your example was an instance of **defeasible reasoning**.
- ▶ You are not **allowed** to use FOL for non-monotonic reasoning.
- ▶ I revised conclusions when new evidence contradicts previous assumptions.
- ▶ I do not know!



# Different non-monotonic approaches

- ▶ Default Logic
  - ▶ By default, a robot can function, except its hand is broken.
  - ▶ By default, a train keep working, except it detect an obstacle.
- ▶ Logic Programming with Negation as Failure
- ▶ Answer Set Programming (ASP)
- ▶ Formal Argumentation

# Why do AI students need to know about default theory?

1. **Non-Monotonic Reasoning:** Default logic is a key formalism in non-monotonic reasoning.
2. **Knowledge Representation:** In AI, effective knowledge representation is essential for building intelligent systems that can make decisions and solve problems. Default logic provides a framework for representing and reasoning about incomplete or uncertain knowledge.
3. **Dealing with Exceptions:** In real-world scenarios, not all information is explicitly known or stated, and default reasoning allows AI systems to make plausible inferences in the absence of complete information.

# Outline

Reasoning is often Defeasible

Monotonic vs. Non-monotonic Reasoning

Why is standard logic not suitable?

**Default Logic**

Syntax

Semantics

# Default Logic

Consider the knowledge base: “**Usually** birds can fly, except the abnormal ones”, “Tweety is a bird. All birds are animals”.



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Consider the knowledge base: “**Usually** birds can fly, except the abnormal ones”, “Tweety is a bird. All birds are animals”.



Which part of our knowledge is **monotonic**?

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Which part of our knowledge is **monotonic**?

- ▶  $W$  : **monotonic part**

Tweety is a bird. All birds are animal.

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Consider the knowledge base: “**Usually** birds can fly, except the abnormal ones”, “Tweety is a bird. All birds are animals”.



Which part of our knowledge is **monotonic**?

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Which part is **non-monotonic**?

# Default Logic

Consider the knowledge base: “**Usually** birds can fly, except the abnormal ones”, “Tweety is a bird. All birds are animals”.



Which part of our knowledge is **monotonic**?

- ▶  $W$  : **monotonic part**  
Tweety is a bird. All birds are animal.

Which part is **non-monotonic**?

- ▶  $D$  : **non-monotonic part**  
**Usually** birds can fly, except the abnormal ones

# Default Theories: Monotonic part

“Tweety is a bird. All birds are animal”.



- ▶ **Monotonic part:** We use **first order logic formula**
- ▶ “Tweety is a bird.”
  - ▶  $\text{Bird}(t)$
- ▶ All birds are animal.
  - ▶  $\forall x : (\text{Bird}(x) \rightarrow \text{Animal}(x))$
- ▶  $W = \{ \text{Bird}(t), \forall x : \text{Bird}(x) \rightarrow \text{Animal}(x) \}$

## Default Theories: Non-Monotonic part

- ▶ “Usually birds can fly, except the abnormal ones”



- ▶ **Non-monotonic part:** default rules of inference
- ▶ “Usually birds can fly, except the abnormal ones”
  - ▶  $\text{Bird}(x) : x \text{ is a bird}$
  - ▶  $\text{Ab}(x) : x \text{ is an abnormal bird}$
  - ▶  $\text{Fly}(x) : x \text{ can fly}$
- ▶ “Usually birds fly, except the abnormal ones”

$$\delta = \frac{\text{Bird}(x) : \neg \text{Ab}(x)}{\text{Fly}(x)}$$

# Default Theories

“Usually birds fly, except the abnormal ones”, “Tweety is a bird. All birds are animal”.

- ▶ Default theory is a pair  $(W, D)$  such that:

**$W$  presents monotonic part:** called **background theory**

- ▶ Tweety is a bird. All birds are animal.

$$W = \{ \text{Bird}(t), \forall x : \text{Bird}(x) \rightarrow \text{Animal}(x) \}$$

**$D$  presents non-monotonic part:** contains **default rules**

- ▶ “Usually birds fly except, the abnormal ones,”

$$\delta = \frac{\text{Bird}(x) : \neg \text{Ab}(x)}{\text{Fly}(x)}$$

# Default Theories

## Definition: Default Theory

A default theory  $T$  is a pair  $(W, D)$ , s.t.,

- ▶  $W$  : is a set of propositional or first order logic formulas (called the facts or axioms of  $T$ ),
- ▶  $D$  is a countable set of default rules

## Example

$$D = \left\{ \frac{\text{train: } \neg \text{Obstacle}}{\text{Move}} \right\}, W = \{\text{train}\}$$

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$$D = \left\{ \frac{\text{Robot} : \neg \text{HandsBroken}}{\text{Works}} \right\}, W = \{\text{Robot}, \text{HandsBroken}\}$$

# Default Logic

**Defaults (informally):** domain specific inference rules

$$\delta = \frac{\alpha : \beta_1, \dots, \beta_n}{\gamma}$$

**Intuitive reading:** If  $\alpha$  has been derived, and  $\neg\beta_1, \dots, \neg\beta_n$  are not derivable, then  $\gamma$  can be concluded.

## Example

$$\delta = \frac{\text{Bird(Tweety)} : \neg\text{Ab(Tweety)}}{\text{Fly(Tweety)}}$$

If it is provable that Tweety is a bird, and it is not provable that Tweety is abnormal, then we can infer that Tweety can fly.

## Default Formally

$$\delta = \frac{\alpha : \beta_1, \dots, \beta_n}{\gamma}$$

- ▶ The formula  $\alpha$  is called the **prerequisite**, denoted by  $pre(\delta)$ .
- ▶  $\beta_1 \dots \beta_n$  are called **justifications**, denoted by  $just(\delta)$
- ▶  $\gamma$  is the **consequent** of  $\delta$ , denoted by  $cons(\delta)$

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- ▶  $\gamma$  is the **consequent** of  $\delta$ , denoted by  $cons(\delta)$
- ▶ ( $\alpha, \beta_i, \gamma$  are **propositional formulas**)
- ▶ ‘Default rule’ with free variables in  $\alpha, \beta_i, \gamma$  is a **schema** for all its ground instances.

$$\frac{Bird(x) : \neg Ab(x)}{Fly(x)}$$

## Flashback: Human Reasoning



▶ What's up?!

## Flashback: Human Reasoning



▶ I found my mistakes.



▶ What's up?!

## Flashback: Human Reasoning



► **usually** birds can fly, except penguin!

► What is your idea about:  
$$\frac{\text{Bird}(x) : \neg\text{Penguin}(x)}{\text{Fly}(x)}$$



► What's up?!

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$$\frac{\text{Bird}(x) : \neg\text{Penguin}(x)}{\text{Fly}(x)}$$
- ▶ First, I gave you  $W = \{ \text{Bird}(\text{tweety}) \}$ .  
Your answer was correct, because there was no assumption that Tweety is a penguin.



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- ▶ Next, more information more set of facts!



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- ▶ It means if it is a bird and there is no assumption that it is a penguin, then it can fly.
- ▶  $W' = \{ \text{Bird}(\text{tweety}), \text{Penguin}(\text{tweety}), \forall x : (\text{Penguin}(x) \rightarrow \neg\text{Fly}(x)) \}$

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 $\neg\text{Fly}(\text{tweety})$

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Your answer was correct, because there was no assumption that Tweety is a penguin.
- ▶ Next, more information more set of facts!
- ▶ How did you get this new consequence?



- ▶ What's up?!
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# Informal Discussion of the Semantics

## Example

Given  $T = (W, D)$  s.t.,  $D = \left\{ \frac{\text{Bird}(x) : \neg \text{Ab}(x)}{\text{Fly}(x)} \right\}$  and  $W = \{\text{Bird}(t), \text{Bird}(f), \text{Ab}(f)\}$

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Default rule  $\delta = \frac{\alpha : \beta_1 \dots \beta_n}{\gamma}$  is **applicable** in default theory  $T$  if the **prerequisite**  $\alpha$  is true, and each  $\beta_i$ , for  $1 \leq i \leq n$ , is **consistent with our current beliefs**, then  $\delta$  is **applicable** to  $T$ . In consequence we are led to believe that conclusion  $\gamma$  is true.

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- ▶ Consequence: we believe that  $\text{Bird}(t), \text{Fly}(t), \text{Bird}(f), \text{Ab}(f)$ .

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- ▶  $W = \{\text{Republican}(\text{Nixon}), \text{Quaker}(\text{Nixon})\}$
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- ▶ Is  $\delta_1$  applicable in  $T$ ?
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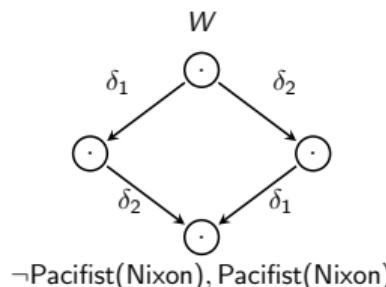
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$$E = \{\text{Pacifist}(\text{Nixon}), \neg\text{Pacifist}(\text{Nixon})\}$$

$E$  is **inconsistent!**

- ▶ **The current method has to be modified!**

# Default Theory: logical consequence

## How can the logical consequences of a default theory be formally defined?

- ▶ The **semantics** of Default Logic will be given in terms of **extensions**.
- ▶ Recall: In classical logics, we used **models** to define entailment.
- ▶ In default logics, it is not so easy — extensions will play a similar role to models.
- ▶ Intuitively, extensions represent **possible world views** which are based on the given default theories; they seek to extend the set of known facts with “reasonable” conjectures based on the available defaults.

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Given default theory  $T = (W, D)$ . A set of formulas of  $E$  is an **Extension** s.t.

- ▶  $W \subseteq E$
- ▶  $Cn(E) = E$
- ▶  $E$  is created by applying applicable defaults
- ▶  $E$  is maximal: **formally**: if  $\frac{\alpha:\beta_1\dots\beta_n}{\gamma} \in D$ ,  $\alpha \in E$ , and  $\neg\beta_1, \dots, \neg\beta_n \notin E$ , then  $\gamma \in E$

## Extensions

### Naive definition of extension

Let  $T = (W, D)$  be a default theory. Define a sequence  $E_0, E_1, \dots$  as follows:

- ▶  $E_0 = Cn(W)$

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- ▶  $E$  is an **extension** if  $E = \bigcup_{i=0}^{\infty} E_i$

## Naive Extension: example

Given  $T = (W, D)$  s.t.  $W = \{\text{Bird}(t)\}$ ,  $D = \left\{ \frac{\text{Bird}(x) : \neg \text{Ab}(x)}{\text{Fly}(x)}, \frac{\text{Fly}(x) : \neg \text{Exception}(x)}{\text{Ascend}(x)} \right\}$

- ▶  $E_0 = Cn(\{\text{Bird}(t)\})$ ;

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Given  $T = (W, D)$  s.t.  $W = \{\text{Bird}(t)\}$ ,  $D = \left\{ \frac{\text{Bird}(x) : \neg \text{Ab}(x)}{\text{Fly}(x)}, \frac{\text{Fly}(x) : \neg \text{Exception}(x)}{\text{Ascend}(x)} \right\}$

- ▶  $E_0 = Cn(\{\text{Bird}(t)\})$ ;
- ▶  $E_1 = Cn(E_0 \cup \{\text{Fly}(t)\})$ ;

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## Naive Extension Problem

Given default theory  $T = (W, D)$  s.t  $W = \{\text{Dutch(bart)}, \text{Logician(bart)}\}$ ,

$$\delta_1 : \frac{\text{Dutch}(x) : \text{Sporty}(x)}{\text{IceScater}(x)}, \quad \delta_2 : \frac{\text{Logician}(x) : \text{Philosopher}(x)}{\text{Philosopher}(x)} \quad \delta_3 : \frac{\text{Philosopher}(x) : \neg \text{Sporty}(x)}{\neg \text{Sporty}(x)}$$

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- ▶  $E_0 = \text{Cn}(W)$ ;
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$$E = Cn(\{\text{Dutch(bart)}, \text{Logician(bart)}, \text{IceScater(bart)}, \text{Philosopher(bart)}, \neg \text{Sporty(bart)}\})$$

## Naive Extension

Is there any problem in extension

$$E = Cn(\{ \text{Dutch(bart)}, \text{Logician(bart)}, \text{IceScater(bart)}, \text{Philosopher(bart)}, \neg \text{Sporty(bart)} \})?$$

1. Everything is quite fine with this extension.
2. It does not make sense to conclude that Bart is an ice scater and he is not sporty.
3.  $\delta_1$  is applicable if there is no assumption that Bart is not sporty.
4.  $\delta_3$  is applicable if there is no assumption that Bart is sporty.
5. We cannot apply both  $\delta_1$  and  $\delta_3$ , but it is not covered in the naive extension definition.



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# Processes

Let  $T = (W, D)$  be a default theory

- ▶ A default rule  $\frac{\alpha:\beta_1,\dots,\beta_n}{\gamma}$  is **applicable** to a set of formulas  $S$  iff:
  - ▶  $\alpha \in S$ ;
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  - ▶  $\Pi[k] = \delta_1, \dots, \delta_k$  :  $k$  initial segments of  $\Pi$
  - ▶  $In(\Pi) = Cn(W \cup \{cons(\delta) \mid \delta \text{ occurs in } \Pi\})$
  - ▶  $Out(\Pi) = \{\neg\beta \mid \beta \in just(\delta), \text{ for some } \delta \text{ occurring in } \Pi\}$

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## Definition

- ▶  $\Pi$  is called a **process** of  $T$  if  $\delta_k$  is applicable to  $In(\Pi[k])$  for every  $\delta_k \in \Pi$
- ▶  $\Pi$  is **successful** iff  $In(\Pi) \cap Out(\Pi) = \emptyset$ , otherwise it **fails**.
- ▶  $\Pi$  is **closed** iff every  $\delta$  that is applicable to  $In(\Pi)$  already occurs in  $\Pi$ .

## Extension

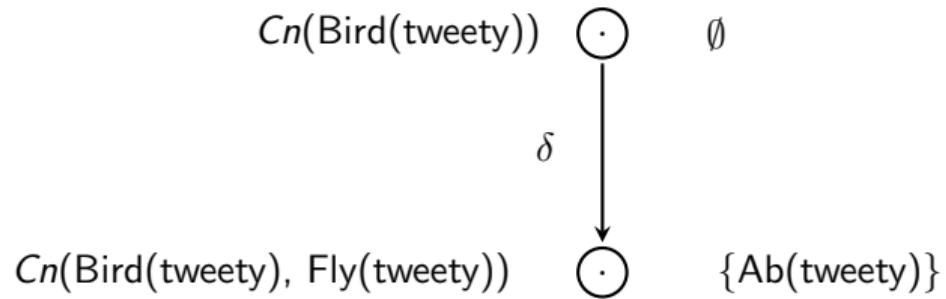
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### Definition: Extension

A set of formulae  $E$  is an extension of the default theory  $T$  iff there is some **closed** and **successful** process  $\Pi$  of  $T$  such that  $E = In(\Pi)$

## Extension

Let  $T = (W, D)$  be a default theory, s.t., s.t.  $W = \{\text{Bird(tweety)}\}$  and  $D = \{\delta = \frac{\text{Birds}(x) : \neg \text{Ab}(x)}{\text{Fly}(x)}\}$



- ▶  $\Pi = (\delta)$  is successful and closed
- ▶  $E = Cn(\text{Bird(tweety)}, \text{Fly(tweety)})$

## Extensions: A process tree

### Process tree

Given default theory  $T = (W, D)$ , in the **process tree** of the  $T$ :

- ▶ The nodes of the tree are labeled with  $In(\Pi)$  (on the left) and  $Out(\Pi)$  (on the right)
- ▶ The edges correspond to default applications, and are labeled with the default that is being applied.
- ▶ The paths of the process tree starting at the root correspond to processes of  $T$ .

## Example: A Process Tree

Given default theory  $T = (W, D)$  with  $W = \{a\}$  and  $D = \{\delta_1, \delta_2\}$ :

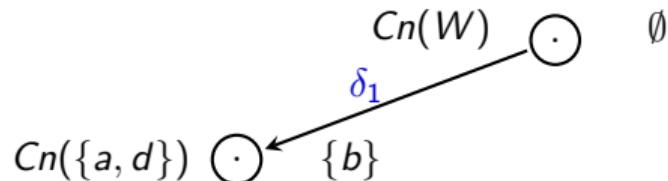
$$\delta_1 = \frac{a : \neg b}{d}, \quad \delta_2 = \frac{\text{true} : c}{b}$$

$$Cn(W) \quad \bigcirc \quad \emptyset$$

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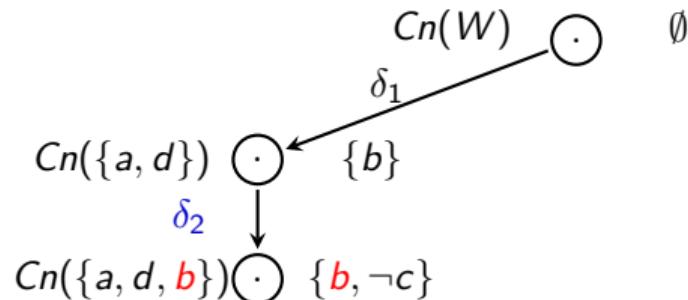


- ▶ For  $\Pi_1 = (\delta_1)$  we have  $In(\Pi_1) = Cn(\{a, b\})$ , and  $Out(\Pi_1) = \{b\}$ .  $In(\Pi_1)$  successful but not closed since  $\delta_2$  can be applied to  $In(\Pi_1)$ .

## Example: A Process Tree

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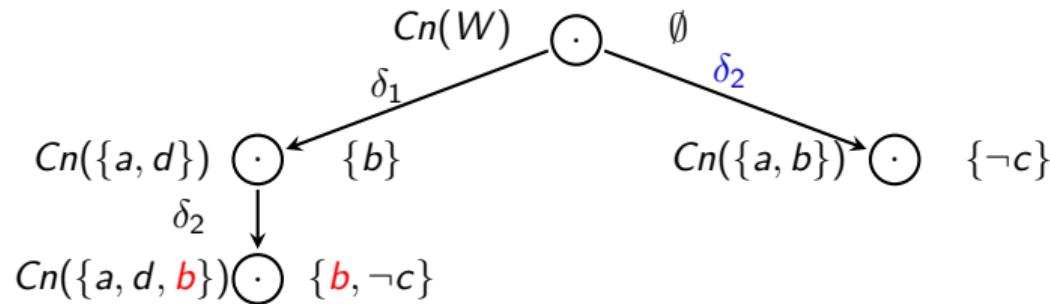


- Let  $\Pi_2 = (\delta_1, \delta_2)$ . It is failed because  $In(\Pi_2) \cap Out(\Pi_2) = \{b\}$ .

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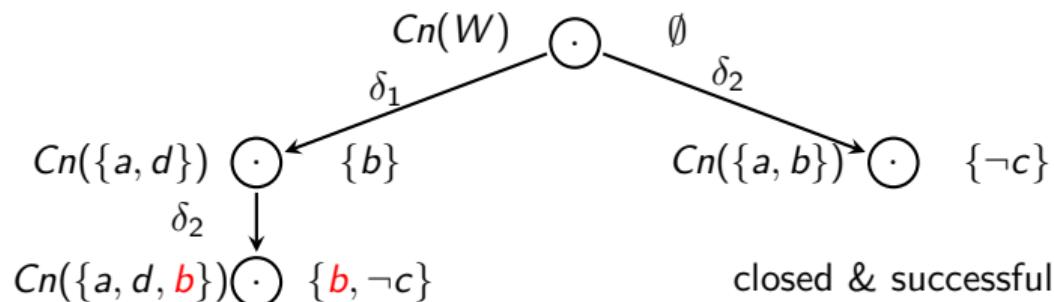
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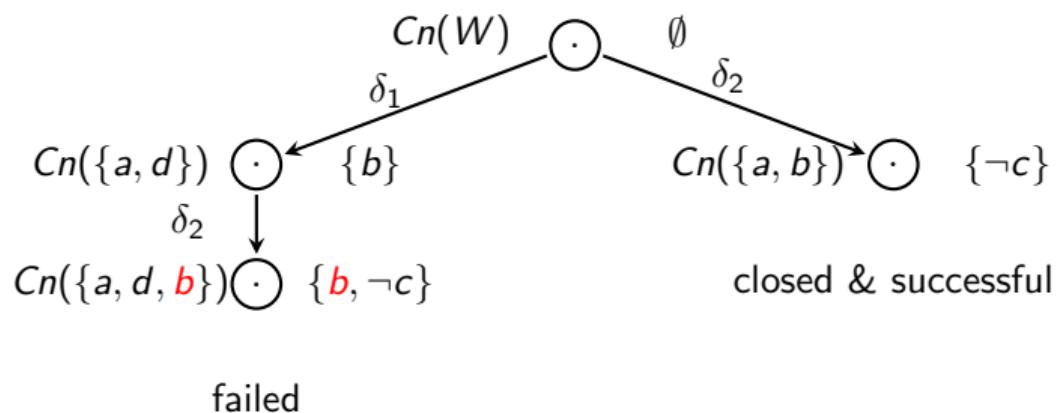


- ▶ Let  $\Pi_3 = (\delta_2)$ . It is closed and successful.  $E = Cn(\{a, b\})$ .

## Example: A Process Tree

Given default theory  $T = (W, D)$  with  $W = \{a\}$  and  $D = \{\delta_1, \delta_2\}$ :

$$\delta_1 = \frac{a : \neg b}{d}, \quad \delta_2 = \frac{\text{true} : c}{b}$$



- ▶  $T$  has one extension:  $E = Cn(\{a, b\})$ .

## Extensions: A process tree

### Definition

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### Example

- ▶  $W = \{\text{Republican}(\text{nixon}), \text{Quaker}(\text{nixon})\}$
  - ▶  $D = \{\delta_1, \delta_2\}$  s.t.  $\delta_1 = \frac{\text{Republican}(x) : \neg \text{Pacifist}(x)}{\neg \text{Pacifist}(x)}$ ,  $\delta_2 = \frac{\text{Quaker}(x) : \text{Pacifist}(x)}{\text{Pacifist}(x)}$
- $Cn(W) \quad \odot \quad \emptyset$

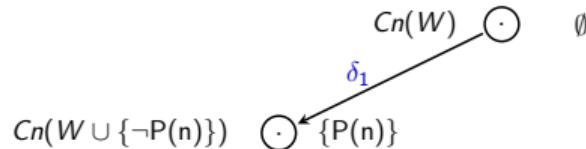
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- ▶ Let  $\Pi_1 = (\delta_1)$ .

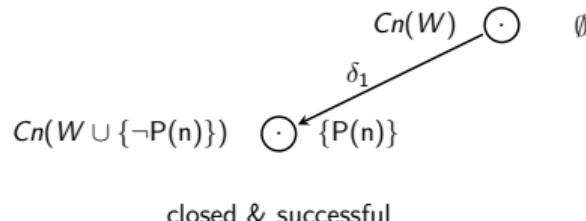
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- ▶ Let  $\Pi_1 = (\delta_1)$ . It is closed and successful.  $E_1 = Cn(W \cup \{\neg P(n)\})$

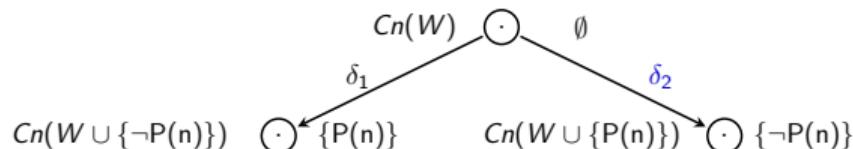
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closed & successful

- ▶ Let  $\Pi_2 = (\delta_2)$ .

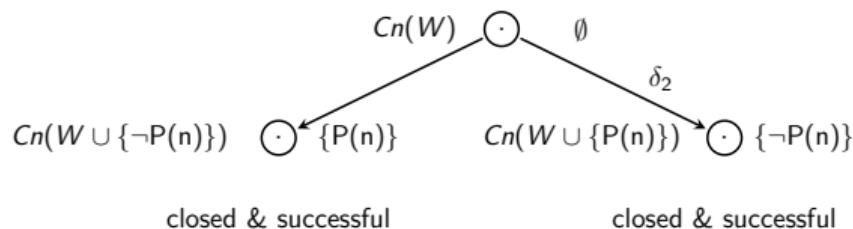
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- ▶ Let  $\Pi_2 = (\delta_2)$ . It is closed and successful.  $E_2 = Cn(W \cup \{P(n)\})$

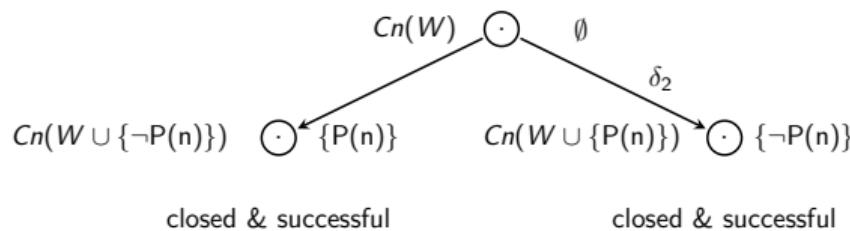
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- ▶ This default theory has two extensions:  $E_1 = Cn(W \cup \{\neg P(n)\})$  and  $E_2 = Cn(W \cup \{P(n)\})$ .

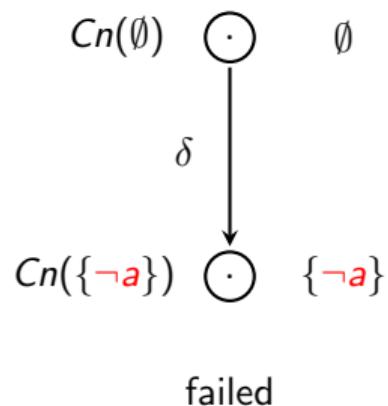
# Is there always an extension?

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Let  $T = (W, D)$  with  $W = \{\}$  and  $D = \{\frac{\text{true}:a}{\neg a}\}$

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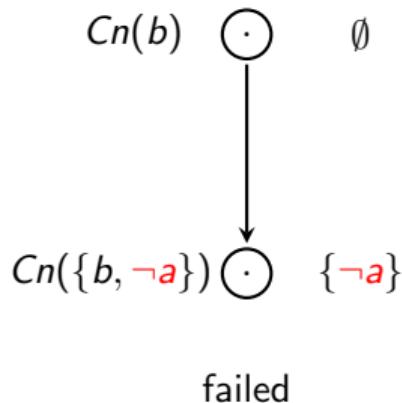
- ▶ A default logic may not have an extension

## Is there always an extension?

Let  $T = (W, D)$  with  $W = \{b\}$  and  $D = \{\frac{\text{true}:a}{\neg a}\}$

# Is there always an extension?

Let  $T = (W, D)$  with  $W = \{b\}$  and  $D = \{\frac{\text{true}:a}{\neg a}\}$



- ▶ It does not have any extension!

# Normal Default Theory

## Normal Default Rule

A default  $\delta$  is **normal** if  $\text{just}(\delta) = \text{cons}(\delta)$ .

$$\frac{\alpha : \gamma}{\gamma}$$

## Example

$$\frac{\text{Bird(tweety)} : \text{Fly(tweety)}}{\text{Fly(tweety)}}$$

If it is provable that Tweety is a bird, and it is not provable that Tweety cannot fly, then we can infer that Tweety can fly.

# Normal Default Theory

## Theorem

Normal default theories always have extensions.

## Exercise

- ▶ Does the default theory  $(W, D)$  where,  $W = \{a, d\}$ ,  $\delta_1 = \frac{a : b}{b}$ ,  $\delta_2 = \frac{b : c}{c}$ ,  $\delta_3 = \frac{d : \neg c}{\neg c}$  has an extension?
- ▶ Draw the process tree of this default theory.

## This Lecture

- ▶ Defeasible reasoning
- ▶ Monotonic vs. non-monotonic reasoning
- ▶ Default Theory

## Next lecture

- ▶ Abstract argumentation frameworks