## Aide à la décision/ Decision aid

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Partie 2/Part 2
Gestion des incohérences/Inconsistency handling

## What is a knowledge?

It is information we have about agents' beliefs or preferences.

## Outline

- Classical logic
- Inference in classical logic
- Non-classical inference/Inconsistency handling methods: The flat case
- Non-classical inference/Inconsistency handling methods: The prioritized case
- Reasoning about prioritized knowledge

## Brief background on classical propositional logic

- Let V be a set of propositional variables denoted by  $a, b, c, \cdots$
- Propositional language PL<sub>V</sub> is built on
  - V,
  - $\{\top, \bot\}$  (respectively tautology and contradiction),
  - usual connectors  $\land, \lor, \neg, \rightarrow, \leftrightarrow$ .
- ullet Formulas in  $PL_V$  are denoted by

$$\phi, \psi, \varphi, \cdots, \phi_1, \phi_2, \cdots, \psi_1, \psi_2, \cdots, \varphi_1, \varphi_2, \cdots$$

- Inference is denoted by ⊢
- Let  $\Sigma = \{\phi_1, \cdots, \phi_n\}$ 
  - $\bullet \ \bigwedge \Sigma = \phi_1 \wedge \cdots \wedge \phi_n$
  - $\bullet \ \bigvee \Sigma = \phi_1 \vee \cdots \vee \phi_n$

#### Inference

Given  $\phi$  and  $\phi \to \psi$  we deduce  $\psi$ .

We write  $\phi, \phi \rightarrow \psi \vdash \psi$ 

## Complementary definitions

- $\bullet$  Let  $\Sigma$  be a multiset of formulas (the same formula may be present several times)
- A sub-base A of  $\Sigma$  ( $A \subseteq \Sigma$ ) is consistent if and only if  $\bigwedge A \not\vdash \bot$
- ullet We suppose that  $\Sigma$  is not deductively closed

## $A \subseteq \Sigma$ is maximally consistent if and only if

- A is consistent, and
- either  $A = \Sigma$  or adding any formula  $\phi$  from  $\Sigma \backslash A$  to A entails the inconsistency of  $A \cup \{\phi\}$

### $A\subseteq\Sigma$ is minimally inconsistent if and only if

- $A \vdash \perp$ , and
- $\forall \phi \in A, A \setminus \{\phi\} \not\vdash \bot$

Let  $Inc(\Sigma) = \{\phi, \exists A \subseteq \Sigma \text{ such that } \phi \in A, A \text{ is minimally inconsistent} \}$ .  $Inc(\Sigma)$  is the set of formulas belonging to at least one minimally inconsistent sub-base of  $\Sigma$ .

## Where does inconsistency come from?

The presence of exceptions

#### Example

- Penguins are birds
- Birds fly
- A penguin doesn't fly
- Titi is a penguin
- Knowledge is provided from multiple sources

#### Example

- Agent 1: We will have a course tomorrow
- Agent 2: If it rains then we don't have course
- Agent 3: It will rain tomorrow

#### How to solve conflicts?

- Revise the knowledge base and restore consistency
- Cope with inconsistency and define non-classical inference

# Non-classical inference/Inconsistency handling methods

The flat case

## An argumentative consequence relation (1)

## A sub-base A of $\Sigma$ is an argument for a formula $\phi$ iff

- $A \not\vdash \bot$  (A is consistent),
- $\bullet$   $A \vdash \phi$ ,
- **③**  $\forall \psi \in A$ ,  $A \setminus \{\psi\} \not\vdash \phi$  (A is minimal)

We write  $\langle A, \phi \rangle$  which stands for "A is an argument for  $\phi$ ".

- Why condition 1?
   From an inconsistent base we can deduce a formula and its contradiction.
- Why condition 2?  $(\phi:$  it is raining),  $(\psi:$  I should use my umbrella). Is  $\langle \{\phi\}, \psi \rangle$  an argument??
- Why condition 3?  $(\phi:$  it is raining),  $(\phi \to \psi:$  if it is raining, then I should use my umbrella),  $(\varphi:$  I like paprika). Is  $\langle \{\phi, \phi \to \psi, \varphi\}, \psi \rangle$  an argument??

## An argumentative consequence relation (2)

- $\phi$  is an argumentative consequence of  $\Sigma$ , denoted by  $\Sigma \vdash_{\mathcal{A}} \phi$ , iff
  - there exists an argument for  $\phi$  in  $\Sigma$ , and
  - there is no argument for  $\neg \phi$  in  $\Sigma$

## An argumentative consequence relation Example

Consider a discussion in a newspaper editorial office about whether or not to proceed with the publication of some indiscretion about a prominent politician. Suppose the key bits of information are captured by the following five statements.

- Simon Jones is a Member of Parliament
- If Simon Jones is a Member of Parliament then we need not keep quiet about details of his private life
- Simon Jones just resigned from the House of Commons
- If Simon Jones just resigned from the House of Commons then he is not a Member of Parliament
- If Simon Jones is not a Member of Parliament then we need to keep quiet about details of his private life

## How good is argumentative consequence?

Example: Let 
$$\mathbf{\Sigma} = \{\psi, \psi 
ightarrow \phi, 
eg \psi \}$$

• Is  $\phi$  an argumentative consequence of  $\Sigma$ ?

## Argumentative vs classical inference

Under which conditions we have

$$\Sigma \vdash \phi \text{ iff } \Sigma \vdash_{\mathcal{A}} \phi$$
?

## Free consequence

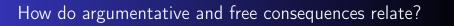
#### Definition: Free formula

 $\varphi \in \Sigma$  is free iff  $\varphi \notin Inc(\Sigma)$ .  $Free(\Sigma) = \Sigma \setminus Inc(\Sigma)$ 

#### Definition: Free consequence

 $\phi$  is a free consequence of  $\Sigma$ , denoted by  $\Sigma \vdash_{\mathit{Free}} \phi$ , iff  $\mathit{Free}(\Sigma) \vdash \phi$ 

Example:  $\Sigma = \{\phi, \neg \phi \lor \neg \psi, \psi, \neg \phi \lor \varphi, \neg \psi \lor \varphi\}$ 



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## Universal consequence (or MC-consequence)

 $MC(\Sigma)$  is the set of maximally consistent sub-bases of  $\Sigma$ 

#### Definition

 $\phi$  is a MC-consequence of  $\Sigma$ , denoted by  $\Sigma \vdash_{MC} \phi$ , iff  $\forall A \in MC(\Sigma), A \vdash \phi$ 

Example:  $\Sigma = \{\phi, \neg \phi \lor \neg \psi, \psi, \neg \phi \lor \varphi, \neg \psi \lor \varphi\}$ 

How do MC- and argumentative (resp. free) consequences relate?

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## Lexicographical (or cardinality-based) consequence (1)

One of the main difficulties for implementing the MC-consequence is the cardinality of  $MC(\Sigma)$  which exponentially increases with the number of conflicts in  $\Sigma$ . The lexicographical consequence is based on a subset of  $MC(\Sigma)$ .

$$A \in L(\Sigma)$$
 iff  $A \in MC(\Sigma)$  and  $\forall B \in MC(\Sigma)$ ,  $|A| \ge |B|$ ,

where  $|\Gamma|$  is the cardinality (number of elements) of  $\Gamma$ .

#### Definition: L-consequence

 $\phi$  is a L-consequence of  $\Sigma$ , denoted by  $\Sigma \vdash_L \phi$ , iff  $\forall A \in L(\Sigma)$ ,  $A \vdash \phi$ 

Lexicographical (or cardinality-based) consequence (2)

Example: 
$$\Sigma = \{\psi \to \phi, \psi, \neg \psi, \neg \phi \land \neg \psi, \neg \phi\}$$

How do lexicographical and MC- (resp. argumentative-) consequences relate?

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## Existential consequence

#### **Definition**

 $\phi$  is an existential consequence of  $\Sigma$ , denoted by  $\Sigma \vdash_{\exists} \phi$ , iff  $\exists A \in MC(\Sigma), A \vdash \phi$ 

Example:  $\Sigma = \{\psi \to \phi, \psi, \neg \psi, \neg \phi \land \neg \psi, \neg \phi\}$ 

How do existential and lexicographical (resp. argumentative) consequences relate?

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# Non-classical inference/Inconsistency handling methods

The prioritized case

## What are priorities and where do they come from?

- Priority is very important in the study of knowledge-based systems
- A priority represents uncertainty or preferences associated with knowledge
- Priorities may represent the reliability/preference of sources/knowledge
- The task of coping with inconsistency is greatly simplified since conflicts have better chance to be solved

## Prioritized knowledge bases

- Prioritized knowledge bases are layered, that is, of the form  $\Sigma = S_1 \cup \cdots \cup S_n$ , such that formulas in  $S_i$  have the same priority and are more prioritized than formulas in  $S_j$  with j > i. Sometimes we write  $\Sigma = \{S_1, \cdots, S_n\}$
- Each S<sub>i</sub> is a multiset: copies of the same formula may appear in the same layer or in different layers. They are considered as distinct
- $\phi \in \Sigma$  means that there is a copy of  $\phi$  in  $\Sigma$
- We sometimes use the notation  $\phi \in_i \Sigma$  for  $\phi \in S_i$
- $\phi \not\in_i \Sigma$  means that  $\phi \not\in S_i$  (however it may belong to other layers of  $\Sigma$ )
- Adding a formula  $\phi$  to the *i*th layer  $S_i$  of  $\Sigma$  is denoted  $\Sigma \cup \{\phi\}_i$
- Sub-bases are denoted by capital letters  $A, B, C, \ldots$  They are also represented in a stratified form  $A = A_1 \cup \cdots \cup A_n$ , with  $A_i \subseteq S_i$  ( $A_i$  may be empty)

## Possibilistic consequence (1)

#### Definition: i-consequence

Let  $\Sigma = S_1 \cup \cdots \cup S_n$  be a layered belief base. A formula  $\phi$  is an *i*-consequence of  $\Sigma$ , denoted by  $\Sigma \vdash_i \phi$ , iff:

- **1**  $S_1 \cup \cdots \cup S_i$  is consistent,
- $S_1 \cup \cdots \cup S_i \vdash \phi$ , and

#### Definition: $\pi$ -consequence

 $\phi$  is a  $\pi$ -consequence of  $\Sigma$  if  $\phi$  is an i-consequence of  $\Sigma$  for some i, and denote it by  $\Sigma \vdash_{\pi} \phi$ .

## Possibilistic consequence (2)

It is possible to characterize the set of  $\pi$ -consequences of  $\Sigma$ .

- We compute the set  $\pi(\Sigma)$  defined as:  $\pi(\Sigma) = S_1 \cup \cdots \cup S_i$ , such that  $S_1 \cup \cdots \cup S_i$  is consistent and  $S_1 \cup \cdots \cup S_{i+1}$  is inconsistent.
- If  $\Sigma$  is consistent then  $\pi(\Sigma) = \Sigma$ .
- i+1 is called the *inconsistency degree* of  $\Sigma$ . If  $\Sigma$  is consistent then  $Inc(\Sigma)=0$ .
- $\Sigma \setminus \pi(\Sigma)$  is simply inhibited.

#### It is not hard to check that

$$\Sigma \vdash_{\pi} \phi \text{ iff } \pi(\Sigma) \vdash \phi$$

#### Example

- Let  $\Sigma_1 = \{ \{p\}, \{ \neg p \lor b, \neg p \lor \neg f\}, \{ \neg b \lor f\} \}$
- Let  $\Sigma_2 = \{\{p\}, \{\neg p \lor b, \neg p \lor \neg f\}, \{\neg b \lor w\}\}$

## Possibilistic consequence (3)

Dealing with inconsistency using possibilistic consequence is not entirely satisfactory. The latter suffers from the "drowning problem".

#### Example

Let 
$$\Sigma = \{ \{ \neg \phi \lor \neg \psi \}, \{ \phi \}, \{ \psi \}, \{ \xi \} \}.$$

A particular case of the drowning effect is called "blocking of property inheritance".

$$\Sigma = \{\{p\}, \{\neg p \lor b, \neg p \lor \neg f\}, \{\neg b \lor f, \neg b \lor w\}\},\$$

p, b, f, w respectively mean penguin, bird, fly, wings.

Based on  $\Sigma$ , it is not possible for a penguin to inherit properties of birds (in our example, to inherit property of having wings), while the only undesirable property for a penguin in our example is "flying".

## Free consequence (1)

#### Definition: Dominant sub-base

The dominant sub-base of  $\Sigma$  is

$$\Sigma^* = \textit{Free}(S_1) \cup \textit{Free}(S_1 \cup S_2) \cup \cdots \cup \textit{Free}(S_1 \cup \cdots \cup S_n).$$

#### Properties of the dominant sub-base

- For a given  $i \geq 1$ , if a formula  $\phi$  in  $S_1 \cup \cdots \cup S_i$  does not belong to  $Free(S_1 \cup \cdots \cup S_i)$  then it will not belong to  $Free(S_1 \cup \cdots \cup S_k)$  for  $k \geq i$ .
- In general, there is no inclusion relation between  $Free(S_1 \cup \cdots \cup S_i)$  and  $Free(S_1 \cup \cdots \cup S_k)$  with k > i.

#### Definition: Free consequence

A formula  $\phi$  is a free consequence of  $\Sigma$ , denoted by  $\Sigma \vdash_{ND}$ , iff  $\Sigma^* \vdash \phi$ .

## Free consequence (2)

#### Example

Let  $\Sigma = \{\{p\}, \{\neg p \lor b, \neg p \lor \neg f\}, \{\neg b \lor f, \neg b \lor w\}\}$ 

## Linear consequence (1)

The sub-base  $I(\Sigma)$  is obtained by dropping layers  $S_i$  when they are inconsistent with the previous ones. Namely,  $I(\Sigma)$  is constructed in the following way:

$$I(S_1) = \begin{cases} S_1 & \text{if } S_1 \text{ is consistent} \\ \emptyset & \text{otherwise.} \end{cases}$$

for i > 1:

$$I(S_1 \cup \cdots \cup S_i) = \begin{cases} I(S_1 \cup \cdots \cup S_{i-1}) \cup S_i & \text{if consistency} \\ I(S_1 \cup \cdots \cup S_{i-1}) & \text{otherwise.} \end{cases}$$

#### Definition: Linear consequence

 $\phi$  is a linear consequence of  $\Sigma$ , denoted by  $\Sigma \vdash_I \phi$ , iff  $I(\Sigma) \vdash \phi$ .

## Linear consequence (2)

#### Example

$$\Sigma = \{\{p\}, \{\neg p \lor b, \neg p \lor \neg f\}, \{\neg b \lor f, \neg b \lor w\}\}$$

#### Remark

- Linear consequence is more productive than possibilistic consequence. However it does not solve the problem of the drowning effect.
- Linear consequence and free consequence are incomparable.

## Argumentative consequence (1)

### Definition: A reason/argument of rank i

A sub-base A of  $\Sigma$  is a reason of rank i for a formula  $\phi$  if it satisfies the following conditions:

- A ⊬⊥
- $\bullet$   $A \vdash \phi$

#### Definition: Argumentative consequence

- $\phi$  is an argumentative consequence of  $\Sigma$ , denoted by  $\Sigma \vdash_{\mathcal{A}} \phi$ , iff:
  - there exists an argument of rank i for  $\phi$  in  $\Sigma$ , and
  - arguments for  $\neg \phi$  (if any) are of rank j > i.

## Argumentative consequence (2)

#### Example

Let 
$$\Sigma = \{ \{ \neg c \}, \{ \neg a \lor \neg b \lor c, \neg d \lor c, \neg e \lor c \}, \{ d, e, f, \neg f \lor \neg g \lor c \}, \{ a, b, g, h \} \}$$

## Application: Access Control in Medical Problem

- If Mary plays patient role then she plays non staff member role.
- If Mary plays patient role then she is permitted to read her medical record.
- If Mary plays a non staff member role then she is not permitted to read her medical record.
  If Jean plays doctor role then he is permitted to read Mary's record.

#### Question

Is Mary permitted to read her medical record?