

# Non-Monotonic Logic

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# Readings

## Suggested:

- ▶ Frank Veltman, lecture notes on counterfactuals (sec. 5).  
[https://staff.fnwi.uva.nl/f.j.m.m.veltman/papers/  
Notes\\_Counterfactuals.pdf](https://staff.fnwi.uva.nl/f.j.m.m.veltman/papers/Notes_Counterfactuals.pdf)
- ▶ S. Kraus, D. Lehmann & M. Magidor (1990), *Nonmonotonic Reasoning, Preferential Models and Cumulative Logics*.

# Plan

1. Defeasible Reasoning
2. Cumulative Consequence Relation
3. Preferential Models
4. Applications

# Outline

1. Defeasible Reasoning
2. Cumulative Consequence Relation
3. Preferential Models
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# Defeasible reasoning

*Birds fly.*



- ▶ We often use **generalizations** that are *rationally compelling* but not deductively valid.
- ▶ We are talking about what *normally* or *typically* happens, not about exceptionless laws.
- ▶ Reasoning is **defeasible** when conclusions may have to be withdrawn in the light of further information, even if we keep our original premises.

# Broad cases of defeasible reasoning

- ▶ **Everyday decision-making:** Lights are off in a café, so you assume it's closed. Then you see people inside and an "Open" sign: you keep "lights looked off from outside", but give up "the café is closed".
- ▶ **Social reasoning:** Your friend normally replies within minutes. This time they don't answer for hours, so you think they're upset. Then you learn they were on a long flight: you keep that they usually reply quickly, but drop "they're upset with me".
- ▶ **Default categorization (Tweety):** From "Tweety is a bird" we infer "Tweety flies". Learning "Tweety is a penguin", we keep that Tweety is a bird and that birds normally fly, but reject "Tweety flies".

# Monotonicity: formal notion

Let  $\models$  be a (single-conclusion) consequence relation between sets of formulas and formulas.

$\models$  is **monotonic** if for all sets  $\Gamma, \Delta$  and all  $\varphi$ :

$$\text{if } \Gamma \models \varphi, \text{ then for every } \Delta \supseteq \Gamma, \Delta \models \varphi$$

Adding premises never invalidates an earlier consequence.

Classical consequence  $\models$  (and standard proof systems for classical logic) satisfy monotonicity.

A consequence relation  $\sim$  is **non-monotonic** if there exist  $\Gamma \subseteq \Delta$  and  $\varphi$  such that

$$\Gamma \sim \varphi \text{ but } \Delta \not\sim \varphi$$

New information can *defeat* previous conclusions.

# Non-monotonic reasoning in practice

We use a non-monotonic consequence symbol  $\sim$  (read  $\alpha \sim \beta :=$  if  $\alpha$ , then normally  $\beta$ ):

$$\text{Bird}(x) \sim \text{Flies}(x)$$

- ▶ From the knowledge base  $K = \{\text{Bird}(\text{Tweety})\}$  we may infer

$$K \sim \text{Flies}(\text{Tweety}).$$

- ▶ After adding  $\text{Penguin}(\text{Tweety})$ , and a more specific default

$$\text{Penguin}(x) \sim \neg \text{Flies}(x),$$

the enlarged  $K' = K \cup \{\text{Penguin}(\text{Tweety})\}$  no longer supports  $\text{Flies}(\text{Tweety})$ . Instead we get

$$K' \sim \neg \text{Flies}(\text{Tweety}).$$

- ▶ This is exactly a failure of monotonicity.

# From Aristotle to AI



John McCarthy  
(1927–2011)



Raymond Reiter  
(1939–2002)

- ▶ Aristotle already distinguished strict demonstration from more tentative, practical reasoning based on generalizations.
- ▶ In modern logic, **non-monotonic logic** is the study of formal systems intended to capture defeasible reasoning patterns.
- ▶ In AI and knowledge representation, many formalisms were proposed:
  - **Negation as failure** in logic programming.
  - **Circumscription** (McCarthy).
  - **Default logic** (Reiter).
  - ...
- ▶ These different formalisms all induce some *non-monotonic consequence relation*  $\sim$  on formulas.

# Today's focus: the KLM perspective

Kraus, Lehmann & Magidor (KLM):



Sarit Kraus



Daniel Lehmann



Menachem  
Magidor

- ▶ Treat  $\sim$  itself as primitive:  $\varphi \sim \psi$  reads  
“from  $\varphi$ , it *normally* follows  $\psi$ .”
- ▶ *Which structural rules should a reasonable non-monotonic consequence relation satisfy?*
  - **C** (cumulative relations).
  - **CL** (cumulative with Loop).
  - **P** (preferential relations).
  - **R** (rational relations, later work).
  - and some further, stronger systems.
- ▶ Prove *representation theorems*: each such family corresponds to a natural class of models (with preferences between worlds/states).

Today: focus on **cumulative and preferential relations** and system C and P.

# Outline

1. Defeasible Reasoning
2. Cumulative Consequence Relation
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# Cumulative consequence C

A consequence relation  $\sim$  is **cumulative** iff it satisfies the rules:

1. **Reflexivity:**  $\varphi \sim \varphi$
2. **Left logical equivalence:** if  $\varphi \models \psi$  and  $\psi \models \varphi$ , and  $\varphi \sim \chi$ , then  $\psi \sim \chi$ .
3. **Right weakening:** if  $\varphi \models \psi$  and  $\chi \sim \varphi$ , then  $\chi \sim \psi$ .
4. **Cut:** if  $\varphi \wedge \psi \sim \chi$  and  $\varphi \sim \psi$ , then  $\varphi \sim \chi$ .
5. **Cautious monotonicity:** if  $\varphi \sim \psi$  and  $\varphi \sim \chi$ , then  $\varphi \wedge \psi \sim \chi$ .

- ▶ System C is meant to be the *minimal* structural core of reasonable non-monotonic consequence.
- ▶  $\sim$  is closed under classical equivalence and consequence.
- ▶ Plausible conclusions can be “re-used” (Cut).
- ▶ Learning something you *already* inferred as plausible never harms (CMon).

# Some derived rules (on blackboard)

In system C we can derive, among others, the following rules.

## ► Equivalence

$$\frac{\alpha \sim \beta \quad \beta \sim \alpha \quad \alpha \sim \gamma}{\beta \sim \gamma}$$

If  $\alpha$  and  $\beta$  are plausible consequences of each other, then they have the same plausible consequences.

## ► Another rule

$$\frac{\alpha \vee \beta \sim \alpha \quad \alpha \sim \gamma}{\alpha \vee \beta \sim \gamma}$$

If from  $\alpha \vee \beta$  we plausibly recover  $\alpha$ , and from  $\alpha$  we plausibly get  $\gamma$ , then already  $\alpha \vee \beta$  plausibly entails  $\gamma$ .

# Cumulative models

We give a semantics for system C. Fix a set  $W$  of worlds.

## A cumulative model

$$\mathcal{M}_C = \langle S, \prec, V \rangle$$

has:

- ▶ A set  $S$  of states (sets of worlds, possible “epistemic states” of an agent).
- ▶ A labelling function  $\ell : S \rightarrow \mathcal{P}(W) \setminus \{\emptyset\}$ :  
 $\ell(s)$  is the set of worlds compatible with state  $s$ .
- ▶ A binary relation  $\prec$  on  $S$  expressing *preference / normality*:  
 $s' \prec s$  = “ $s'$  is more normal (preferred) than  $s$ ”.
- ▶ A valuation  $V$  assigning truth values to atoms at worlds:  
 $V(w, p) \in \{0, 1\}$  for each world  $w \in W$  and atomic  $p$ .

Classical satisfaction  $\mathcal{M}_C, w \models \alpha$  is defined in the usual way.

# Cumulative models

## Definition (State satisfaction)

Let  $\mathcal{M}_C = \langle S, \ell, \prec, V \rangle$ . For a state  $s \in S$  and formula  $\alpha$ :

$$s \models \alpha \quad \text{iff} \quad \forall w \in \ell(s) (\mathcal{M}_C, w \models \alpha).$$

So  $s$  satisfies  $\alpha$  iff all its worlds do.

$$\llbracket \alpha \rrbracket^{\mathcal{M}_C} = \{s \in S \mid s \models \alpha\}$$

for the set of states that satisfy  $\alpha$ .

# Cumulative models

## Definition (Smoothness for states)

A subset  $A \subseteq S$  is **smooth** (with respect to  $\prec$ ) iff for every  $s \in A$ :

- ▶ either  $s$  is  $\prec$ -minimal in  $A$ ,
- ▶ or there is some  $\prec$ -minimal  $s' \in A$  with  $s' \prec s$ .

$\mathcal{M}_C$  is a **cumulative model** iff for every formula  $\alpha$ , the set  $[\![\alpha]\!]^{\mathcal{M}_C}$  is smooth.

Smoothness is the analogue of the “no infinite descent” / limit assumption, now formulated for sets of *states*.

## Example: a simple cumulative model

	$p$	$q$
$w_1$	1	1
$w_2$	1	0
$w_3$	0	1

Let  $W = \{w_1, w_2, w_3\}$  and let  $V$  be the valuation given by the table.  
Define a structure

$$\mathcal{M}_C = \langle S, \ell, \prec, V \rangle$$

by:

$$S = \{s_0, s_1\}, \quad \ell(s_0) = \{w_1, w_2\}, \quad \ell(s_1) = \{w_3\}, \quad s_0 \prec s_1.$$

$$\llbracket p \rrbracket^{\mathcal{M}_C} = \{s_0\}, \quad \llbracket q \rrbracket^{\mathcal{M}_C} = \{s_1\}, \quad \llbracket \top \rrbracket^{\mathcal{M}_C} = \{s_0, s_1\}.$$

In each of these sets the  $\prec$ -minimal elements are well behaved (e.g.  $s_0$  is the unique minimal element of  $\llbracket \top \rrbracket^{\mathcal{M}_C}$ ), so  $\mathcal{M}_C$  satisfies the smoothness condition and is therefore a cumulative model.

How to make smoothness fail here? Add  $s_1 \prec s_0$ .

# Consequence in cumulative models

Given a cumulative model

$$\mathcal{M}_C = \langle S, \ell, \prec, V \rangle$$

we define a model-relative consequence relation  $\vdash_{\mathcal{M}_C}$ .

**Definition (Cumulative consequence in  $\mathcal{M}_C$ )**

$$\alpha \vdash_{\mathcal{M}_C} \beta \quad \text{iff} \quad \text{for every } \prec\text{-minimal } s \in \llbracket \alpha \rrbracket^{\mathcal{M}_C}, s \models \beta.$$

- ▶ Collect all states where  $\alpha$  holds:  $\llbracket \alpha \rrbracket^{\mathcal{M}_C}$ .
- ▶ Restrict to the *best* (most normal)  $\alpha$ -states (the  $\prec$ -minimal ones).
- ▶ If in all these best  $\alpha$ -states every compatible world satisfies  $\beta$ , then  $\beta$  is a *cumulative consequence* of  $\alpha$ .

# Example: consequence in a cumulative model

Take atoms  $b, f, r$ .

	$b$	$f$	$r$
$w_1$	1	1	0
$w_2$	1	0	1
$w_3$	0	0	0

Let  $W = \{w_1, w_2, w_3\}$  and let  $V$  be the valuation given by the table.  
Define a cumulative model

$$\mathcal{M}_C = \langle S, \ell, \prec, V \rangle$$

by

$$S = \{s_1, s_2, s_3\}, \quad \ell(s_1) = \{w_1\}, \quad \ell(s_2) = \{w_2, w_3\}, \quad \ell(s_3) = \{w_3\}$$

and a preference relation

$$s_1 \prec s_2 \quad s_1 \prec s_3$$

with no further  $\prec$ -links.

$$b \mid_{\mathcal{M}_C} f \quad b \wedge r \mid_{\mathcal{M}_C} f \quad \neg f \not\mid_{\mathcal{M}_C} \neg r$$

# Representation theorem for system C

## Theorem (KLM representation for C)

A consequence relation  $\sim$  on formulas is **cumulative** iff there exists a cumulative model

$$\mathcal{M}_C = \langle S, \ell, \prec, V \rangle$$

such that, for all formulas  $\alpha, \beta$ ,

$$\alpha \sim \beta \quad \text{iff} \quad \alpha \sim_{\mathcal{M}_C} \beta$$

- ▶ The proof rules of system C exactly capture reasoning in cumulative models.
- ▶ Preferential models are a *special case*:
  - $S$  is a set of states, each labelled by a *single* world,
  - $\prec$  is a strict partial order on  $S$ .

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# The move to preferential models

- ▶ In a **cumulative model**, a state  $s \in S$  is an *information state*:  $\ell(s) \subseteq W$  is the set of worlds compatible with what is currently taken for granted.
- ▶ States can therefore be “coarse-grained”: one state may keep several classical possibilities open at once.
- ▶ A **preferential model** is the special case where every state is a singleton:  $\ell(s) = \{w\}$ . We *collapse* states with worlds and order the worlds directly.
- ▶ This makes the normality ordering more concrete: we compare “how things might be” world by world, just as in Lewis-Stalnaker similarity semantics for counterfactuals.
- ▶ Trade-off:
  - we gain simplicity and a tighter fit with the counterfactual picture
  - but lose generality: not every cumulative consequence relation can be represented by an ordering on single worlds.

# Example

Take atoms  $p, q$  and worlds:  $w_1 : p \wedge q$        $w_2 : p \wedge \neg q$

Consider states:

$s_{\text{coarse}} := \{w_1, w_2\}$  (“we know  $p$ , but  $q$  is still open”)

$s_1 := \{w_1\}$        $s_2 := \{w_2\}$

We might prefer the “generic” state where only  $p$  is settled:

$s_{\text{coarse}} \prec s_1, \quad s_{\text{coarse}} \prec s_2.$

In a pure **preferential** model, we only see  $w_1$  and  $w_2$ . There is no separate node for the information state

“ $p$  is known,  $q$  is undetermined”.

So we lose the ability to order and reason about *information states* as such. We only order ‘fully specified’ ways the world might be.

The cumulative model above is actually ‘representable’ by a preferential model. How? Can you think of a case which cannot be represented in preferential models?

# Example

Take atoms  $p, q, r$  and worlds:

$$w_1 : p \wedge q \wedge r \quad w_2 : \neg p \wedge q \wedge r \quad w_3 : p \wedge \neg q \wedge \neg r$$

Consider states:

$$s_p := \{w_1\} \quad s_q := \{w_2\} \quad s_{\text{coarse}} := \{w_2, w_3\}$$

We order states by:

$$s_{\text{coarse}} \prec s_p, \quad s_{\text{coarse}} \prec s_q$$

$$p \not\sim r \quad q \not\sim r \quad (p \vee q) \not\sim r$$

There is no way, just by ordering *worlds*, to make the “most normal  $p \vee q$ -situation” behave like our coarse state  $\{w_2, w_3\}$  that mixes  $r$  and  $\neg r$  while still treating  $p$  and  $q$  separately as  $r$ -supporting.

# Preferential models

A **preferential model** is a triple

$$\mathcal{M}_P = \langle W, \prec, V \rangle$$

such that:

- ▶  $\prec$  is a strict partial order on  $W$
- ▶ for every formula  $\alpha$ , the truth set  $\llbracket \alpha \rrbracket^{\mathcal{M}_P} = \{w \in W \mid w \models \alpha\}$  is **smooth** with respect to  $\prec$ .

## Definition (Smoothness for worlds)

A subset  $A \subseteq W$  is **smooth** (with respect to  $\prec$ ) iff for every  $w \in A$ :

- ▶ either  $w$  is  $\prec$ -minimal in  $A$ ,
- ▶ or there is some  $\prec$ -minimal  $w' \in A$  with  $w' \prec w$ .

# Preferential consequence

## Definition (Preferential consequence)

Given a preferential model  $\mathcal{M}_P = \langle W, \prec, V \rangle$ , define:

$\alpha \vdash_{\mathcal{M}_P} \beta$  iff for every  $\prec$ -minimal  $w \in \llbracket \alpha \rrbracket^{\mathcal{M}_P}$ ,  $w \models \beta$ .

$$\llbracket \alpha \rrbracket^{\mathcal{M}_P} = \{w \in W \mid \mathcal{M}_P, w \models \alpha\}$$

So we:

- ▶ look at all  $\alpha$ -worlds,
- ▶ pick the *most normal* ones (the  $\prec$ -minimal  $\alpha$ -worlds),
- ▶ and require all of them to satisfy  $\beta$ .

# Knowledge bases and preferential entailment

A (default) knowledge base  $K$  is a set of conditionals

$$\alpha \succsim \beta$$

## Definition (Satisfaction of a knowledge base)

Let  $K$  be a set of conditionals  $\alpha \succsim \beta$ . A preferential model  $\mathcal{M}_P = \langle W, \prec, V \rangle$  satisfies  $K$  iff for every  $\alpha \succsim \beta \in K$  we have

$$\alpha \succsim_{\mathcal{M}_P} \beta$$

## Definition (Preferential entailment)

Let  $K$  be a set of conditionals. We write

$$K \models_{\text{pref}} \alpha \succsim \beta$$

iff for every preferential model  $\mathcal{M}_P$ : if  $\mathcal{M}_P$  satisfies  $K$ , then

$$\alpha \succsim_{\mathcal{M}_P} \beta$$

# Example: a bird-penguin knowledge base

Atoms:  $b$  (bird),  $f$  (flies),  $p$  (penguin).

Consider the knowledge base

$$K = \{p \succsim b, p \succsim \neg f, b \succsim f\}$$

- ▶ Any preferential model  $\mathcal{M}_P$  that satisfies  $K$  must make the most normal  $p$ -worlds *non-flying birds*.
- ▶ In all such models we also have:

$$p \wedge b \succsim_{\mathcal{M}_P} \neg f$$

so

$$K \models_{\text{pref}} p \wedge b \succsim \neg f$$

- ▶  $K \not\models_{\text{pref}} p \succsim f$  [countermodel on blackboard]
- ▶  $K \models_{\text{pref}} f \succsim \neg p$  [proof on blackboard]

# System P (preferential consequence)

System P is system C plus one extra rule, **Or**.

1. **Reflexivity**  $\varphi \sim \varphi$

2. **Left logical equivalence**

If  $\varphi \models \psi$  and  $\psi \models \varphi$ , and  $\varphi \sim \chi$ , then  $\psi \sim \chi$ .

3. **Right weakening**

If  $\varphi \models \psi$  and  $\chi \sim \varphi$ , then  $\chi \sim \psi$ .

4. **Cut**

If  $\varphi \sim \psi$  and  $\varphi \wedge \psi \sim \chi$ , then  $\varphi \sim \chi$ .

5. **Cautious monotonicity**

If  $\varphi \sim \psi$  and  $\varphi \sim \chi$ , then  $\varphi \wedge \psi \sim \chi$ .

6. **Or**

If  $\varphi \sim \chi$  and  $\psi \sim \chi$ , then  $\varphi \vee \psi \sim \chi$ .

# Reading the Or rule

**Or:** if  $\varphi \vdash \chi$  and  $\psi \vdash \chi$ , then  $\varphi \vee \psi \vdash \chi$ .

If both  $\varphi$  and  $\psi$  individually are good enough reasons for  $\chi$ , then so is their disjunction.

- (1)
  - a. If John comes to the party, it will normally be great.
  - b. If Cathy comes to the party, it will normally be great.
  - c. So if either John or Cathy comes, it will normally be great.

# Some derived rules in P (blackboard)

In P we can derive several rules:

## S-rule

$$\frac{\varphi \wedge \psi \succsim \chi}{\varphi \succsim (\psi \supset \chi)}$$

## Union

$$\frac{\varphi \succsim \psi \quad \chi \succsim \gamma}{\varphi \vee \chi \succsim \psi \vee \gamma}$$

# Representation theorem

Theorem (KLM representation for P)

A consequence relation  $\sim$  on formulas satisfies all rules of system P iff there exists a preferential model

$$\mathcal{M}_P = \langle W, \prec, V \rangle$$

such that, for all formulas  $\varphi, \psi$ ,

$$\varphi \sim \psi \quad \text{iff} \quad \varphi \sim_{\mathcal{M}_P} \psi$$

For a knowledge base  $K$ , the *closure* of  $K$  under the rules of P coincides with preferential entailment:

$$K \vdash_P \varphi \sim \psi \quad \text{iff} \quad K \models_{\text{pref}} \varphi \sim \psi$$

So to know what  $K$  *preferentially entails*, we can also reason syntactically with P instead of quantifying over all preferential models.

# Duplicate labels and the representation theorem

Fix a propositional language with atoms  $p, q$  and this valuation:

	$p$	$q$
$w_0$	0	0
$w_1$	1	0
$w_2$	1	1
$w_3$	1	1

We define a preferential model  $\mathcal{M}_P = \langle W, \prec, V \rangle$  by:

$$W = \{w_0, w_1, w_2, w_3\}$$

$$w_0 \prec w_2, \quad w_1 \prec w_3 \quad \text{and no other } \prec\text{-links.}$$

- ▶ This is a perfectly good preferential model (smoothness holds,  $\prec$  is a strict partial order).
- ▶ It defines a consequence relation  $\sim_W$  that satisfies all rules of system P, so  $\sim_W$  is a preferential consequence relation.
- ▶ However, there is **no** preferential model with *unique labels* (i.e. with taking worlds-as-valuations identifying  $w_2$  with  $w_3$ ) that induces exactly the same consequence relation  $\sim_W$ .

# Representation theorems

The **representation theorem** is a global, *structural* result about consequence relations:

- ▶ Fix a proof system (e.g. C or P).
- ▶ Consider all binary relations  $\sim$  on formulas.
- ▶ The theorem says:  
 $\sim$  satisfies the rules of the system  $\iff \sim = \sim_{\mathcal{M}}$  for some model  $\mathcal{M}$
- ▶ So it *classifies* which abstract consequence relations are exactly those induced by a given class of models.

**Soundness and Completeness** (for a fixed entailment notion) is a more familiar, *formula-level* result:

- ▶ Fix a semantics (e.g. preferential models) and a proof system (e.g. P).
- ▶ For a knowledge base  $K$  and a conditional  $\alpha \sim \beta$ :

$$K \vdash_P \alpha \sim \beta \iff K \vDash_{\text{pref}} \alpha \sim \beta$$

- ▶ This says: whatever is valid in *all* models is derivable, and vice versa.

# An underivable rule

Notably, **P** does *not* validate the following rule:<sup>1</sup>

## Rational Monotonicity:

if  $\varphi \vdash x$  and  $\varphi \not\vdash \neg\psi$ , then  $\varphi \wedge \psi \vdash x$ .

Is this a good rule for non-monotonic reasoning?

We have already encountered this rule before. How was it called and to what example was related?

Similarity analysis of counterfactuals: *Strengthening with a Possibility* axiom scheme and *The Verdi-Bizet-Satie* example.

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<sup>1</sup> Adding this rule to system **P** yields system **R** (Lehmann & Magidor 1992). Semantically, **R** corresponds to ranked models: there is a total preorder  $\leq$  on  $W$  (a ranking of worlds) whose strict part is  $\prec$ . Thus any two worlds are comparable in rank, i.e. for all  $v, w \in W$  we have  $v \leq w$  or  $w \leq v$  (or both).

# Preferential Models and Counterfactuals

We can make the connection with the similarity framework we introduced for counterfactuals, with the following additional assumptions:

- ▶ The limit assumption:  $\prec$  is a well-founded partial order on  $W$ .
- ▶ **Absoluteness:** for every  $u, w \in W : \prec_u = \prec_w$  [ $\prec_w$  is independent of  $w$ ]
- ▶ **Universality:** for every  $w \in W, W_w = W$  [the ordering is on  $W$ ]

Recall the original clause for counterfactuals.

$M \models (\varphi \rightsquigarrow \psi)$  iff for every world  $w \in W, M, u \models \psi$  for every closest  $\llbracket \varphi \rrbracket$ -world  $u$  to  $w$ .

With Universality and Absoluteness, we can simplify it as follows:

$M \models (\varphi \rightsquigarrow \psi)$  iff  $M, u \models \psi$  for every  $\prec$ -minimal  $\llbracket \varphi \rrbracket$ -world  $u$ .

And then we rewrite  $M \models (\varphi \rightsquigarrow \psi)$  as  $\varphi \vdash_{\mathcal{M}_P} \psi$ .

# Object language vs metalanguage

- The conditional  $\rightsquigarrow$  (for counterfactuals) is an *object-language* connective:

$$\varphi \rightsquigarrow \psi$$

is a formula that can itself be embedded.

- The non-monotonic consequence symbol  $\succsim$  is a *metalanguage* relation:

$$\varphi \succsim \psi$$

is not a formula of  $L$ , but a statement about  $L$ .

- In the KLM approach, the central object of study *is* this relation  $\succsim$  and its structural properties.

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# The frame problem

Consider designing how a robot should reason about actions and change.

- (2)    a. If the daylight sensor is low, turn on the light.  
      b. If the temperature is low, turn on the heating.

In classical logic we might have:

$$\text{DaylightLow} \rightarrow \text{LightOn}$$

$$\text{TempLow} \rightarrow \text{HeatingOn}$$

But what about persistence?

- ▶ After turning the light on, should the robot keep believing that the light is *still* on at the next time step?
- ▶ Writing explicit “frame axioms” saying that everything stays the same unless affected by an action quickly leads to an explosion of axioms.

# A non-monotonic take on the frame problem

Idea: use *default persistence* rules instead of explicit frame axioms.

Introduce discrete time steps  $t, t+1, \dots$  and write  $F_t$  for “ $F$  holds at time  $t$ ”.

For each  $F$  (light on, heating on, ...) we have a default:

$$F_t \succsim F_{t+1}$$

“if  $F$  holds at time  $t$ , then *normally*  $F$  still holds at time  $t+1$ ”.

- ▶ This replaces a huge family of classical frame axioms by a small, uniform *schema* of non-monotonic persistence rules.
- ▶ The rules are **defeasible**:
  - e.g. if we also know that the action at  $t$  is *TurnOffLight*, then the default  $LightOn_t \succsim LightOn_{t+1}$  is *defeated*.
- ▶ Non-monotonicity is crucial: new information about actions can make the robot *retract* a previous persistence conclusion without changing the earlier facts.

# Grice and implicatures

- (3) A: Does John speak English?  
B: Well, he knows the colours.

- ▶ From B's answer we *normally* infer that John does not speak English (or at least not very well): if B could honestly say "Yes", that would be more informative.
- ▶ This is a **conversational implicature**: a defeasible inference driven by the assumption that speakers respect conversational maxims.
- ▶ The inference is **non-monotonic**: it can be cancelled without contradiction, e.g.  
B: Well, he knows the colours. In fact, his English is pretty good.

# Pronoun resolution as default reasoning

(4) John met Bill at the station. *He* greeted *him*.

- ▶ By default, we resolve pronouns in line with simple preferences (e.g. subject → “he”, object → “him”):

$$\text{John} = \textit{he}, \quad \text{Bill} = \textit{him}.$$

- ▶ This preferred interpretation is a **default**: it reflects what *normally* happens, given the syntax and discourse structure.
- ▶ But it is **defeasible**. Additional material can force a different resolution, e.g.

(5) John met Bill at the station. *He* greeted *him*.  
Then John greeted him as well.

- ▶ Now we are pushed to reinterpret the first sentence so that *he* = Bill, *him* = John.

# Temporal anaphora and non-monotonicity

- ▶ In narrative discourse with simple past tense, there is a strong **default**: events are understood as occurring in the order in which they are mentioned (forward-moving timeline).
- ▶ This default is **defeasible**: world knowledge or discourse relations can override it.

(6) John fell. Mary pushed him.

- ▶ The default forward-reading would place John's falling *before* Mary's pushing.
- ▶ But our knowledge about causation and the more natural discourse relation forces a different ordering: Mary pushed John *before* he fell.
- ▶ Asher & Lascarides (2003) give a systematic non-monotonic account of such temporal and discourse inferences (and related phenomena like lexical disambiguation).

# Exercise: Soundness of rules in C

- ▶ Show that the rules of system C are sound with respect to cumulative and preferential models.
- ▶ Show that the **Or** rule is sound with respect to preferential models.
- ▶ Show that the **Or** rule is not valid in cumulative models.

# Exercise: Equivalence relation

We define an *equivalence relation* on formulas by:

$$\alpha \sim \beta \iff \alpha \succsim \beta \text{ and } \beta \succsim \alpha$$

Assume  $\succsim$  is a cumulative consequence relation (i.e., it satisfies the rules of System C).

Show that:

$$\alpha \sim \beta \text{ iff } \forall \gamma (\alpha \succsim \gamma \Leftrightarrow \beta \succsim \gamma)$$

# Exercise: Underivable rules in P

Check that the following rules *cannot* be derived in P:

1. If  $\varphi \sim (\psi \supset \chi)$ , then  $\varphi \wedge \psi \sim \chi$ .
2. If  $\varphi \vee \psi \sim \chi$ , then  $\varphi \sim \chi$  or  $\psi \sim \chi$ .

# Exercise: The **And** rule

## **And**

If  $\varphi \vdash \psi$  and  $\varphi \vdash \chi$ , then  $\varphi \vdash \psi \wedge \chi$ .

- ▶ Show that the **And** rule is a derived rule of system C.
- ▶ Show semantically that **And** is valid in cumulative models, without using the representation theorem for C.

# Exercise: rules for P

Show that the following system, with **And** in place of **Cut**, is an equivalent axiomatization of system P:

1. **Reflexivity**  $\varphi \succcurlyeq \varphi$ .

2. **Left logical equivalence**

If  $\varphi \models \psi$  and  $\psi \models \varphi$ , and  $\varphi \succcurlyeq \chi$ , then  $\psi \succcurlyeq \chi$ .

3. **Right weakening**

If  $\varphi \models \psi$  and  $\chi \succcurlyeq \varphi$ , then  $\chi \succcurlyeq \psi$ .

4. **And**

If  $\varphi \succcurlyeq \psi$  and  $\varphi \succcurlyeq \chi$ , then  $\varphi \succcurlyeq \psi \wedge \chi$ .

5. **Cautious monotonicity**

If  $\varphi \succcurlyeq \psi$  and  $\varphi \succcurlyeq \chi$ , then  $\varphi \wedge \psi \succcurlyeq \chi$ .

6. **Or**

If  $\varphi \succcurlyeq \chi$  and  $\psi \succcurlyeq \chi$ , then  $\varphi \vee \psi \succcurlyeq \chi$ .

\*Show that system C with **And** in place of **Cut** is strictly weaker than C (define a non-monotonic consequence relation satisfying **Ref**, **LLE**, **RW**, **CMon**, and **And**, but not **Cut**.)

# Exercise: The Penguin Triangle

$$p = \text{"penguin"} \quad b = \text{"bird"} \quad f = \text{"flies"}$$

Suppose  $K$  contains:

1.  $p \sim b$  (penguins are normally birds)
2.  $p \sim \neg f$  (penguins normally do not fly)
3.  $b \sim f$  (birds normally fly)

Show semantically or by taking the closure of  $K$  under  $\mathbf{P}$ :

1.  $b \sim \neg p$
2.  $b \vee p \sim f$
3.  $b \vee p \sim \neg p$

and explain informally why these are acceptable or problematic.