# Section 4 Autoepistemic Logic

# Subsection 4.1 Introducing autoepistemic logic

# Introducing autoepistemic logic: an example autoepistemic: reflection upon self-knowledge

Idea: formalism to model how an agent forms her own belief sets and how to reason about it.

Example: Are the Stones playing in Newcastle next week? No, because otherwise I would have heard about it.

Observations:

- no definite knowledge that the Stones do not give a concert in Newcastle next week.
- incomplete knowledge and negative answer is rather a conjecture

New knowledge: the Stones are giving a concert in Newcastle next week!

Observations:

- old conclusion by introspection is no longer valid and must be revised—nonmonotonic reasoning!
- long-term knowledge ("If something important is to happen in my city, then I would know about it") has not changed.
- what has changed is that answer is based on fact, not on introspection

Introducing autoepistemic logic: another example

Indicate "believed knowledge" by a modal operator L applied to FOL sentences. L $\varphi$  means intuitively: "I know  $\varphi$ ".

Capture:

• Prof Jones is a university professor and thus normally teaches.

• If I do not believe that Dr. Jones does not teach, then Dr. Jones does teach by the modal formula:

 $Lprof_J \land \neg L \neg teaches_J \longrightarrow teaches_J$ 

The concert example can be captured by:

- concert → Lconcert ("If a concert takes place, then I know about it. ")
- ¬Lconcert ("I don't know that a concert takes place. ")

Towards syntax and semantics

The *L*-operator can appear nested in formulas:  $LL\varphi$  or  $L\neg Lq$  or  $\neg L(p \lor Lq)$ 

The meaning of autoepistemic logic is given in terms of expansions, i.e., pieces of knowledge defining "world views" compatible with and based on the given knowledge.

Expansions are stable, if

- if fact  $\varphi$  is in an expansion, then so is  $L\varphi$
- if fact  $\varphi$  is not in an expansion, then  $\neg L\varphi$  is in the expansion

### Syntax of autoepistemic logic

### Definition 4.1 (Autoepistemic formulas, AE-formula)

Autoepistemic formulas (AE-formulas) are the smallest set satisfying the following:

- each closed FOL formula is an AE-formula
- if  $\varphi$  is an AE-formula, then  $L\varphi$  is an AE-formula
- if  $\varphi$  and  $\psi$  are AE-formulas, then so are the following:

$$\begin{array}{l} - \neg \varphi \\ - (\varphi \land \psi) \\ - (\varphi \lor \psi) \\ - (\varphi \longrightarrow \psi) \end{array}$$

The set of all AE-formulas is denoted by *For*. An autoepistemic theory (AE-theory) is a set of AE-formulas. Syntax of autoepistemic logic—schema

Sometimes it is convenient to use open FOL formulas in the scope of the *L*-operator. In such cases the AE-formula reads as a schema, i.e., a collection of ground instances.

E.g.:

 $german(X) \land \neg L \neg drinksBeer(X) \longrightarrow drinksBeer(X),$ german(bob), german(lisa)

is read as the autoepistemic theory:

 $\begin{array}{l} german(bob) \land \neg L \neg drinksBeer(bob) \longrightarrow drinksBeer(bob) \\ german(lisa) \land \neg L \neg drinksBeer(lisa) \longrightarrow drinksBeer(lisa) \\ german(bob), german(lisa) \end{array}$ 

Some auxiliary notions—*sub* 

### Sub-formula

Let  $\varphi$  be an AE-formula. The set of subformulas of  $\varphi$  ( $sub(\varphi)$ ) is defined as:

- $sub(\varphi) = \emptyset$  for FOL formula  $\varphi$
- $sub(\neg \varphi) = sub(\varphi)$
- $\bullet \ \ {\rm sub}(\varphi \lor \psi) = {\rm sub}(\varphi \land \psi) = {\rm sub}(\varphi \longrightarrow \psi) = {\rm sub}(\varphi) \cup {\rm sub}(\psi)$
- $sub(L\varphi) = \{\varphi\}$

Let T be an AE-theory. The set of subformulas of T is defined as

$$sub(T) = \bigcup_{\varphi \in T} sub(\varphi).$$

Note: we do not go further into the structure of a formula, after the out-most occurrence of *L*.

For example: If  $T = \{L \neg Lq, L(Lp \land r), \neg Lr, s\}$ , then  $sub(T) = \{\neg Lq, (Lp \land r), r\}$ 

Some auxiliary notions—degree, kernel

#### degree

The degree of an AE-formula  $\varphi$  (degree( $\varphi$ )) is the maximal depth of *L*-nestings that occurs in  $\varphi$ .

Let T be an AE-theory, then  $T_n$  denotes the set of AE-formulas in T with degree less or equal n.

For example:  $degree((\neg L \neg L(p \land Lq))) = 3.$ 

#### kernel

The kernel of an AE-theory T is defined as the set of all FOL formulas that are elements of T (denoted  $T_0$ ).

For example: if  $T = \{p, \neg Lq, \neg Lq \longrightarrow s, L \neg Lr, r\}$ , then  $T_0 = \{p, r\}$ .

Normal form for autoepistemic formulas

Definition 4.2 (Normal form) An AE-formula is in normal form, if it has the form

 $\varphi_1 \wedge \varphi_2 \wedge \cdots \wedge \varphi_n$ ,

where each  $\varphi_i$  has the form

$$\beta \lor L\gamma_1 \lor \cdots \lor L\gamma_p \lor \neg L\delta_1 \lor \cdots \lor \neg L\delta_q$$

with a FOL formula  $\beta$ .

Each AE-formula  $\varphi$  can be transformed into an equivalent AE-formula  $(nf(\varphi))$  in normal form, such that  $degree(\varphi) = degree(nf(\varphi))$ .

Semantics of autoepistemic logics

### Definition 4.3 (AE-interpretation)

An autoepistemic interpretation  ${\mathcal I}$  over a signature  $\Sigma$  provides

- a non-empty domain  $dom(\mathcal{I})$
- an interpretation  $f^{\mathcal{I}}$  for each function symbol  $f \in \Sigma$  (as in FOL)
- an interpretation  $r^{\mathcal{I}}$  for each predicate symbol  $r \in \Sigma$  (as in FOL)
- a truth value  $(L\varphi)^{\mathcal{I}}$  for every AE-formula  $L\varphi$ .

As in FOL,  $\mathcal{I} \models \varphi$  indicates that an AE-interpretation  $\mathcal{I}$  satisfies an AE-formula (is an AE-model of)  $\varphi$ .

A formula logically follows from a set M of AE-formulas ( $M \models \varphi$ ) iff  $\varphi$  is valid in all AE-models of M.

For a set of AE-formulas M, Th(M) is the set of AE-formulas that logically follow from M.

Remarks on the semantics

In Def. 4.3 the validity of  $\varphi$  in  $\mathcal{I}$  and the validity of  $L\varphi$  in  $\mathcal{I}$  are unrelated:  $L\varphi$  is treated as a new atom (a 0-ary predicate) and thus independent of  $\varphi$ .

Intuition:

 $\varphi$  expresses truth of  $\varphi$ , whereas  $L\varphi$  expresses belief in (/knowledge of)  $\varphi$ .

This choice of semantics admits to "believe in something false", or "not to believe in something true".

The following alternative definition of the semantics captures this observation.

Algebra-based semantics of autoepistemic logics

An algebra with a belief set is a pair  $(\mathcal{B}, Bel)$ , where

- *B* is a first order interpretation and
- *Bel* is a set of AE-formulas.

Validity of AE-formulas in  $(\mathcal{B}, Bel)$  is defined as:

- $(\mathcal{B}, Bel) \models \varphi$  iff  $\mathcal{B} \models \varphi$  for a closed FO formula  $\varphi$
- $(\mathcal{B}, \mathit{Bel}) \models \neg \varphi \text{ iff } (\mathcal{B}, \mathit{Bel}) \not\models \varphi$
- $(\mathcal{B}, \mathit{Bel}) \models (\varphi \lor \psi) \text{ iff } (\mathcal{B}, \mathit{Bel}) \models \varphi \text{ or } (\mathcal{B}, \mathit{Bel}) \models \psi$
- $(\mathcal{B}, \mathit{Bel}) \models (\varphi \land \psi) \text{ iff } (\mathcal{B}, \mathit{Bel}) \models \varphi \text{ and } (\mathcal{B}, \mathit{Bel}) \models \psi$
- $(\mathcal{B}, \mathit{Bel}) \models (\varphi \longrightarrow \psi) \text{ iff } (\mathcal{B}, \mathit{Bel}) \models \varphi \text{ implies } (\mathcal{B}, \mathit{Bel}) \models \psi$
- $(\mathcal{B}, \mathcal{Bel}) \models L\varphi \text{ iff } \varphi \in \mathcal{Bel}.$

Relationship between the two semantics

The semantics are equivalent.

- 1. From a given AE-interpretation  $\mathcal{I}$ , we define an algebra with a belief set  $(\mathcal{B}, Bel)$  as follows:
  - the domain of  $\mathcal{B}$  and the interpretation function of predicate and function symbols are same as in  $\mathcal{I}$ .
  - $Bel = \{\varphi \mid (L\varphi)^{\mathcal{I}} = true\}$
- 2. From a given algebra with a belief set ( $\mathcal{B}$ , Bel), we define an AE-interpretation  $\mathcal{I}$  as follows:
  - the domain of  $\mathcal{I}$  and the interpretation function of predicate and function symbols are same as in  $\mathcal{B}$ .
  - $(L\varphi)^{\mathcal{I}} = true \text{ iff } \varphi \in Bel.$

Convention: We use the two semantics interchangeably.

By "an AE-interpretation with belief set *Bel*" we mean  $Bel = \{\varphi \mid (L\varphi)^{\mathcal{I}} = true\}$ .

We define " $\varphi$  follows from AE-theory T w.r.t. belief set E" (denoted  $T \models_E \varphi$ ) as  $\varphi$  is valid in every AE-model of T with belief set E.

# Subsection 4.2 Expansions of autoepistemic theories

Towards expansions — considerations

What knowledge would an agent with introspection have given a set of facts (i.e. AE-formulas) *T*?

The agent's knowledge would be a set *E* of AE-formulas that

- includes T
- allows introspection
- is grounded in T (meaning: the knowledge in E must be reconstructable from: T, belief in (knowledge of) E, and non-belief in (non-knowledge of) E)

#### Expansion

#### Let *T* and *E* be sets of AE-formulas. We define the following sets

- $LE = \{L\varphi \mid \varphi \in E\}$
- $\neg LE^C = \{\neg L\psi \mid \psi \notin E\}$
- $\Omega_T(E) = \{ \varphi \mid T \cup LE \cup \neg LE^C \models \varphi \}$

### Definition 4.4 (Expansion)

Let T and E be sets of AE-formulas.

- *E* is *T*-sound iff  $E \subseteq \Omega_T(E)$
- *E* is *T*-complete iff  $\Omega_T(E) \subseteq E$
- *E* is an expansion of *T* iff  $E = \Omega_T(E)$

#### Intuition:

The agent decides to believe in a set of AE-formulas *T*.

Based on this, a set of AE-formulas can be deduced from *T* and the beliefs adopted  $(LE \cup \neg LE^C)$ . If the deduced set is exactly the set of beliefs *E*, then *E* is an expansion.

Alternative characterization of expansions

Observation: AE-models of  $T \cup LE \cup \neg LE^C$  are just the AE-models of T with belief set E!

Thus we obtain an alternative characterization of expansions.

Corollary 4.5 *E* is an expansion of an AE-theory T iff  $E = \{\varphi \mid T \models_E \varphi\}$ .

# Example 4.6 Consider the AE-theory $T_1$ :

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\{german \land \neg L \neg drinksBeer) \longrightarrow drinksBeer, german\}
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This AE-theory has one expansion.

The formula  $\neg drinksBeer$  cannot be derived before  $\neg L \neg drinksBeer$  is contained in the expansion.

The only expansion of  $T_1$  has the kernel:  $Th(\{german, drinksBeer\})$ 

If we extend  $T_1$  by adding:

 $\{(eatsPizza \land \neg LdrinksBeer) \longrightarrow \neg drinksBeer, eatsPizza\}$ 

then the theory has two expansions:

- kernel of the first expansion: { *geman, eatsPizza, drinksBeer* }
- kernel of the second expansion: {*geman, eatsPizza,* ¬*drinksBeer*}

# Subsection 4.3 Stable sets and their properties

#### Stable sets — origin

- Stable belief sets were introduced by Robert Stalnaker in the early '80s
- proposed as a formal representation of the epistemic state of an ideally rational agent, with full introspective capabilities.
- Assumes a propositional language, endowed with a modal operator  $\Box \varphi$  interpreted as " $\varphi$  is believed"
- a set of formulas is a stable set if it is "stable" under classical inference and epistemic introspection
- influenced research on AE logics and nonmonotonic logics in general

#### Definition 4.7 (stable sets)

Let E be a set of autoepistemic formulas. E is called stable iff

- *E* is deductively closed, i.e. E = Th(E),
- $\varphi \in E$  implies  $L\varphi \in E$ , for all AE-formula  $\varphi$ , and
- $\varphi \notin E$  implies  $\neg L\varphi \in E$ , for all AE-formula  $\varphi$

Note: Expansions are stable sets by definition. Thus they inherit all the properties we show for stable sets. Stable sets and expansions

#### Theorem 4.8

For an AE-theory T and a set of AE-formulas E the following statements are equivalent:

- 1. E is an expansion of T
- 2. *E* is stable,  $T \subseteq E$  and is *T*-sound.

Entailment and stable sets

#### Lemma 4.9

For a stable set E and an AE-formula  $\varphi$  the following statements are equivalent:

- a)  $E \models_E \varphi$
- b)  $E \models \varphi$
- c)  $\varphi \in E$

For a FOL formula  $\varphi$ , the statements a)-c) are equivalent to

d)  $E_0 \models \varphi$ 

Stable sets are determined by their kernels

Stable sets are uniquely determined by their objective subsets, i.e. their kernels.

Theorem 4.10 For stable sets E and F,  $E_0 = F_0$  implies E = F.

Existence of stable sets

How can expansions be computed? A first hint

Theorem 4.11 Let T be a first order theory. Then there is a stable set E with  $E_0 = T$ .

Properties of stable sets

### Theorem 4.12 (Orthogonality of stable sets)

Let *E* and *F* be different stable sets. Then  $E \cup F$  is inconsistent.

Proof: blackboard

Theorem 4.13 If *E* is a stable set then it is an expansion of  $E_0$ .

# Subsection 4.4 Computing expansions of AE-theories

#### Considerations

To achieve nonmonotonic behavior w.r.t. AE-theories, formulas ("conjectures") can be added to the set of believes that need not be added.

#### What makes computing expansions difficult?

- nested occurrences of the *L*-operator
- infinitely many conjectures. How to compute all expansions?

#### How to remedy this?

- Nested occurrences of *L*-operator: concentrate on potential kernels of expansions (Theorem 4.10).
- by Coincidence Lemma: it suffices to consider beliefs or non-beliefs in formulas from sub(T) to determine the expansions of T.
   Only those formulas with L-operator play a role in the interpretation of T.

Overview of the computation procedure for expansions

Compute expansions of AE-theories by:

- partition *sub*(*T*) into:
  - E(+): set of beliefs
  - E(-): set of non-beliefs
- Compute the corresponding kernel E(0) of a potential expansion, using T, beliefs in E(+) and non-beliefs in E(-).
- Check whether the stable set determined by E(0) is indeed an expansion

Example – Expansions of AE-theories without *L*-nestings

#### Example 4.14

Let  $T = \{Lp \longrightarrow p\}$ .

Since  $Lp \longrightarrow p$  is the only AE-formula occurring (at top-level) of T,  $sub(T) = \{p\}$ . There are two partitions of  $sub(T) = \{p\}$ .

E(+)	E(-)	<i>E</i> (0)	$E(+) \subseteq E(0)$ ?	$E(-) \cap E(0) = \emptyset?$	expansion?
{ <i>p</i> }	Ø	$Th(\{p\})$	yes	yes	yes
Ø	{ <i>p</i> }	$Th(\emptyset)$	yes	yes	yes

- E(0): set of first order formula that follow from T.
- condition E(+) ⊆ E(0): test whether everything that the agent believes in is in E(0).
- condition  $E(-) \cap E(0) = \emptyset$ : ensures that E(0) does not include non-beliefs of the agent

Procedure for computing expansions for AE-theories without *L*-nestings

Compute expansions no *L*-nesting (*T*)

- 1: Expansions :=  $\emptyset$
- 2: for all partitions E(+) and E(-) of sub(T) do
- 3:  $E(0) := \{ \varphi \in For_0 \mid T \cup LE(+) \cup \neg LE(-) \models \varphi \}$
- 4: if  $E(+) \subseteq E$  AND  $E(-) \cap E = \emptyset$  then

5: Expansions := Expansions 
$$\cup \{E(0)\}$$

- 6: end if
- 7: **end for**
- 8: return Expansions

Example – Expansions of general AE-theories

#### Example 4.15

Let  $T = \{Lp \longrightarrow p, \neg L \neg Lp\}$ , with  $sub(T) = \{p, \neg Lp\}$ . Now the partitions of sub(T) are no longer first order formulas!

<i>E</i> (+)	E(-)	<i>E</i> (0)	$E(+) \subseteq E?$	$E(-) \cap E = \emptyset$ ?	expansion?
{ <i>p</i> , ¬ <i>Lp</i> }	Ø	For <sub>0</sub>	yes	yes	yes
{ <i>p</i> }	{¬ <i>Lp</i> }	$Th(\{p\})$	yes	yes	yes
{¬ <i>Lp</i> }	{ <i>p</i> }	For <sub>0</sub>	yes	no	no
Ø	$\{p, \neg Lp\}$	$Th(\emptyset)$	yes	no	no

- Line 1: E(0) is inconsistent, since  $L\neg Lp$  follows from LE(+), but  $\neg L\neg Lp \in T$ .
- Line 2:  $T \cup LE(+) \cup \neg LE(-) = \{Lp \longrightarrow p, \neg L \neg Lp, Lp\}$ , thus  $E(0) = Th(\{p\})$ . Since  $p \in E$  and E is stable and consistent, we have  $Lp \in E$  and thus  $\neg L \notin E$ .
- Line 3:  $T \cup LE(+) \cup \neg LE(-)$  contains both  $L \neg Lp$  and  $\neg L \neg Lp$ , thus  $E(0) = For_0$
- Line 4:  $T \cup LE(+) \cup \neg LE(-) = \{Lp \longrightarrow p, \neg L\neg Lp, \neg Lp\}$ . From  $p \notin E$  follows  $\neg Lp \in E$  and thus  $E(-) \cap E \neq \emptyset$

Procedure for computing expansions for general AE-theories

Compute expansions (*T*)

- 1: Expansions :=  $\emptyset$
- 2: for all partitions E(+) and E(-) of sub(T) do
- 3:  $E(0) := \{ \varphi \in For_0 \mid T \cup LE(+) \cup \neg LE(-) \models \varphi \}$
- 4: Let *E* be the unique stable set with kernel E(0)
- 5: if  $E(+) \subseteq E$  AND  $E(-) \cap E = \emptyset$  then
- 6: Expansions := Expansions  $\cup \{E(0)\}$
- 7: end if
- 8: **end for**
- 9: return Expansions

Towards the correctness proof

### Lemma 4.16 (Preservation Lemma)

Let *E* be a stable set and *T* an A*E*-theory. If  $E_0 = \{\varphi \in For_0 \mid T \cup LE \cup \neg LE^C \models \varphi\}$ , then  $E = \{\varphi \in For \mid T \cup LE \cup \neg LE^C \models \varphi\}$ .

Proof: blackboard

### Lemma 4.17 (Coincidence Lemma)

Let T be an AE-theory. Consider sets of AE-formulas E(+), E(-), F(+), and F(-) with the following properties:

- $sub(T) \subseteq E(+) \cup E(-)$  and  $E(+) \cap E(-) = \emptyset$  and  $sub(T) \subseteq F(+) \cup F(-)$  and  $F(+) \cap F(-) = \emptyset$
- $E(+) \cap sub(T) = F(+) \cap sub(T)$
- $E(-) \cap sub(T) = F(-) \cap sub(T)$ .

Then the same first order formula follow from  $T \cup LE(+) \cup \neg LE(-)$  as from  $T \cup LF(+) \cup \neg LF(-)$ 

Correctness proof

#### Theorem 4.18

Let T be an AE-theory and let sub(T) be partitioned into the disjoint sets E(+) and E(-). We consider the following steps:

- 1. Compute  $E_0 = \{\varphi \in For_0 \mid T \cup LE(+) \cup \neg LE(-) \models \varphi\}$  and let *E* be the unique stable set with kernel  $E_0$ .
- 2. Check whether  $E(+) \subseteq E$  and  $E(-) \cap E = \emptyset$ .

#### Then the following holds:

- a) If the check in Step 2. is positive, then E is an expansion of T.
- b) Conversely, for every expansion *E* of *T* there is a decomposition of sub(T) into E(+) and E(-) such that
  - $E(0) = E_0$  and
  - the check in Step 2 is positive.

# Subsection 4.5 Embedding Default Logic into AE-Logic

Default logic vs. autoepistemic logic

How to embed default logic into autoepistemic logic?

- Default logic: uses rules AE-logic: uses introspection
- With  $L\varphi$  means " $\varphi$  is known", we get:

 $\frac{german: drinksBeer}{drinksBeer} \quad vs. \quad Lgerman \land \neg L \neg drinksBeer \longrightarrow drinksBeer$ 

What is the semantic relationship between the two formalisms?

Translating default theories to AE-theories

Idea: express consistency of justifications  $\psi$  by  $\neg L \neg \psi$  (" $\neg \psi$  is not known")

#### Definition 4.19 (*trans*())

Let  $\delta = \frac{\varphi : \psi_1, \dots, \psi_n}{\chi}$  be a default rule. We define the translation function for default rules as follows:

$$trans(\delta) = L\varphi \wedge \neg L \neg \psi_1 \wedge \cdots \wedge \neg L \neg \psi_n \longrightarrow \chi.$$

Let T = (W, D) be a default theory. We define the translation function for default theories as follows:

 $trans(T) = W \cup \{trans(\delta) \mid \delta \in D\}.$ 

#### Does this translation preserve the semantics?

How to compare the semantics?

Recall:

- Extension of a default theory: FO formulas only
- Expansion of a AE-theory: FO formulas possibly in scope of *L*-operator

Approach for comparison:

Compare extensions of default theory T with kernels of expansions of translated formulas trans(T).

--such kernels are unique (see Section 4.3) and FO formulas

Plan for this section:

In the following we want to derive conditions under which extensions of a default theory and expansions (of the translated default theory coincide).

Example – difference of expansions and extensions

#### Example 4.20

Consider the default theory  $T_{ex1} = (W, D)$  with  $W = \emptyset$  and  $D = \left\{\frac{p: true}{p}\right\}$ The translation is  $trans(T_{ex1}) = \{Lp \land \neg Lfalse \longrightarrow p\}$ 

The only extension of  $T_{ex1}$  is  $Th(\emptyset)$ , but  $trans(T_{ex1})$  has two expansions:  $Th(\emptyset)$  and  $Th(\{p\})$ .

The second expansion comes from the self-referential nature of expansions!

$$E = \{\varphi \mid T \cup LE \cup \neg LE^C \models \varphi\}$$

If it is decided to believe in *p* (and not in *false*), then *p* can be derived! Whereas in default logic *p* needs to be known by other information! Restricting expansions: minimality of the kernel

#### Definition 4.21

Let *T* be an AE-theory and *E* an expansion of *T*. *E* is an AE-minimal expansion of *T* iff there is no expansion *F* of *T* s.t.  $F_0 \subset E_0$ .

The idea is to concentrate on those expansions (that include the theory and) that cannot be "generated" from a smaller kernel in size.

Does it help? The AE-theory  $trans(T_{ex1})$  from Example 4.20 has one AE-minimal expansion with the kernel:  $Th(\emptyset)$  which is the extension of  $T_{ex1}$ . Example: extension and AE-minimal expansion

#### Example 4.22

Consider the default theory  $T_{ex2} = (W, D)$  with  $W = \emptyset$  and  $D = \left\{ \frac{true : \neg p}{q}, \frac{p : true}{p} \right\}$  which has the single extension  $Th(\{q\})$ .

The AE-theory  $trans(T_{ex2}) = \{Ltrue \land \neg L \neg \neg p \longrightarrow q, Lp \land \neg Lfalse \longrightarrow p\}$  has two expansions:

- $\widehat{E}$  with kernel  $\widehat{E}_0 = Th(\{q\})$  and
- $\widehat{F}$  with kernel  $\widehat{F}_0 = Th(\{p\})$

Both expansions are AE-minimal. But the set of expansions does not coincide with the extension of  $T_{ex2}$ .

AE-minimality still admits to deliberately believe in Lp.

Restricting expansions: grounding expansions

Addressing groundedness of expansions: avoiding arbitrary formulas in expansions by restricting self-referentiality.

#### Definition 4.23 (SS-minimal)

Let *T* be an AE-theory and *E* an expansion of *T*. *E* is an SS-minimal expansion of *T* iff there is no stable set *F* s.t.  $T \subseteq F$  and  $F_0 \subset E_0$ .

SS-minimality implies AE-minimality, but the converse does not hold.

Restricting AE-interpretations to those with stable belief sets:

#### Definition 4.24

Let *SS* denote the class of all stable sets. We define  $T \models_{SS} \varphi$  iff  $T \models_E \varphi$  for all stable sets *E*. FO self-referentiality of expansions

Since  $\models_{SS}$  is stronger than  $\models$ , it allows us to weaken the premises used in the definition of an expansion without losing information.

Lemma 4.25 A set of AE-formulas E is an expansion of an AE-theory T iff  $E = \{\varphi \mid T \cup LE_0 \cup \neg L(For_0 \setminus E_0) \models_{SS} \varphi\}.$ 

Proof: exercise

Intuition of Lemma 4.25 is that the self-referentiality in the definition of expansions has been restricted to FO beliefs.

Moderately grounded expansions

Observation:

Since the only beliefs admitted are those in T, it is admissible to replace  $E_0$  by T in Lemma 4.25.

Definition 4.26 *E* is a moderately grounded expansion of an AE-theory *T* iff  $E = \{\varphi \mid T \cup LT \cup \neg L(For_0 \setminus E_0) \models_{SS} \varphi\}.$ 

Let T be an AE-theory and E a set of AE-formulas. E is a moderately grounded expansion iff E is a SS-minimal expansion of T. Restricting expansions: grounding expansions

Do SS-minimal expansions and extensions coincide?

Consider the default theory  $T_{ex2}$  from Example 4.22 again. Recall: the expansions  $\hat{E}$  with kernel  $Th(\{q\})$  and  $\hat{F}$  with kernel  $Th(\{p\})$  are AE-minimal.

They are also SS-minimal:

- Let S be a stable set with S ⊆ T. Suppose S<sub>0</sub> ⊂ F<sub>0</sub>, then p ∉ S, ¬¬p ∉ S, thus ¬L¬¬p ∈ S and so q ∈ S and q ∈ S<sub>0</sub>. But then S<sub>0</sub> ∉ F<sub>0</sub>, which is a contradiction.
- Suppose S<sub>0</sub> ⊂ Ê<sub>0</sub>, then p ∉ S and ¬¬p ∉ S, therefore ¬L¬¬p ∈ S, and so q ∈ S and q ∈ S<sub>0</sub>. Since S is deductively closed, S<sub>0</sub> is deductively closed, too. Since q ∈ S, S<sub>0</sub> is nor a proper subset of Ê<sub>0</sub>, which is a contradiction.

Analyzing Example 4.22

Recall:  $trans(T_{ex2}) = \{Ltrue \land \neg L \neg \neg p \longrightarrow q, Lp \land \neg Lfalse \longrightarrow p\}$  and its expansion  $\widehat{F}$  has kernel  $\widehat{F}_0 = Th(\{p\})$ .

How was *p* derived from  $(trans(T_{ex2}) \cup L(trans(T_{ex2})) \cup \neg L(For_0 \setminus \widehat{F}_0))$ ?

Let  $(\mathcal{I}, S)$  be an AE-model of  $(trans(T_{ex2}) \cup L(trans(T_{ex2})) \cup \neg L(For_0 \setminus \widehat{F}_0))$  with stable set *S*. Then  $L(\neg L \neg \neg p \longrightarrow q) \in S$ . By stability and consistency of *S*:  $\neg L \neg \neg p \longrightarrow q \in S$ . So,  $L \neg \neg p \in S$  or  $\{q, Lq\} \subseteq S$ . Since  $q \notin \widehat{F}_0$ ,  $(\mathcal{I}, S) \models \neg Lq$  and thus  $q \notin S$  holds. We can conclude:  $L \neg \neg p \in S$ , thus  $\neg \neg p \in S$ ,  $p \in S$  and  $(\mathcal{I}, S) \models Lp$ . Using  $(\mathcal{I}, S) \models Lp \land \neg Lfalse \longrightarrow p$  and  $(\mathcal{I}, S) \models \neg Lfalse$ , we finally get  $(\mathcal{I}, S) \models p$ .

Note that  $L\neg\neg p$  was obtained before  $\neg\neg p$  (self-referential still!). Formula  $L\neg\neg p$  was obtained from rule  $\neg L\neg\neg p \longrightarrow Lq$ . It was applied using contraposition, i.e.  $\neg Lq \longrightarrow L\neg\neg p$ . But, the corresponding default  $\frac{true:\neg p}{q}$  can only be used from top to bottom! Restricting expansions: enforcing unidirectional application

Addressing the possibility to apply AE-implications in both directions.

AE-formula in default normal form are AE-formulas  $L\varphi \wedge \neg L \neg \psi_1 \wedge \cdots \wedge \neg L \neg \psi_n \longrightarrow \chi$ , where  $\varphi, \psi_1, \dots, \psi_n, \chi$  are FO formulas.<sup>6</sup>

#### Definition 4.28

Let T be a AE-theory consisting of FO formulas and AE-formulas in default normal form and let E be an expansion of T.

 $T^E$  denotes the set of AE-formulas  $L\varphi \wedge \neg L \neg \psi_1 \wedge \cdots \wedge \neg L \neg \psi_n \longrightarrow \chi$  in T such that  $\neg \psi_i \notin E$  (for  $1 \leq i \leq n$ ).

*E* is strongly grounded in T iff the following holds:

$$E = \{ \varphi \mid T^E \cup LT^E \cup \neg L(For_0 \setminus E_0) \models_{SS} \varphi \}.$$

For a strongly grounded expansion *E* it is impossible to obtain  $L\psi_i$  from not knowing the consequent  $\chi$ !

Strongly grounded implies moderately grounded

#### Lemma 4.29

Let E be a strongly grounded expansion of an AE-theory T. Then E is a moderately grounded (and thus SS-minimal) expansion of T.

Difference between expansions and extensions

#### To sum up:

Expansions vs. extensions

- 1. Expansions are not necessarily minimal w.r.t. kernel inclusion. Extensions cannot be subsets of other extensions (of the same default theory).
- 2. Expansions may not be "well-grounded" in the given knowledge; can include AE-formulas that it was decided to believe in.
- 3. AE-formulas may be used in both directions, whereas default rules are strictly unidirectional.

Extensions and strongly grounded expansions coincide

#### Theorem 4.30

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

For every extension E of T there is a strongly grounded expansion F of trans(T) such that  $E = F_0$ .

Conversely, the kernel of every strongly grounded expansion of trans(T) is an extension of T.

# Computational complexity of reasoning in autoepistemic logics

- For closed FOL formulas in a logic *L* holds: if satisfiability in *L* is decidable, then so are nonmonotonic reasoning tasks for *L*.
- deciding whether an AE-theory has a stable expansion:  $\Sigma_2^P$ -complete
- credulous reasoning is  $\Sigma_2^P$ -complete cautious reasoning is  $\Pi_2^P$ -complete