



UNIVERSITÄT ZU LÜBECK  
INSTITUT FÜR INFORMATIONSSYSTEME

Özgür L. Özçep

# Ontology Change I

*Lecture 10: AGM Belief Revision*  
*18 June, 2020*

*Informationssysteme CS4130*  
*(Summer 2020)*

# References

- ▶ Eduardo Ferme: Belief Revision from 1985 to 2013  
Slides of IJCAI 2013-Tutorial  
[http://www.ijcai13.org/files/tutorial\\_slides/ta4.pdf](http://www.ijcai13.org/files/tutorial_slides/ta4.pdf)
- ▶ **Lit:** P. Gärdenfors. Knowledge in Flux: Modeling the Dynamics of Epistemic States. The MIT Press, Bradford Books, Cambridge, MA, 1988.
- ▶ **Lit:** S. O. Hansson. A Textbook of Belief Dynamics. Kluwer Academic Publishers, 1999.
- ▶ New book (available as PDF in our library)  
**Lit:** E. Ferme, S. O. Hansson: Belief Change: Introduction and Overview, SpringerBriefs in Intelligent Systems

# Motivation

# Ontology-Level Integration

- ▶ So far: Two (different) types of integration
  - ▶ Data exchange: directed schema-level integration over finite DBs
  - ▶ OBDA: directed schema-level-to-ontology integration

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- ▶ Required in different ontology change scenarios where multiple ontologies exist, such as ontology . . .
  - ▶ import
  - ▶ merge
  - ▶ versioning
  - ▶ development
  - ▶ alignment etc.

**Lit:** G. Flouris et al. *Ontology change: classification and survey*. *The Knowledge Engineering Review*, 23(2):117–152, 2008.

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- ▶ Main problem: Ensuring coherence/consistency along change

## Example (Incompatible ontologies)

$\mathcal{O}_A$

A1  $Article \equiv \exists publ.Journal$

A2  $Journal \sqsubseteq \neg Proceedings$

A3 (*func publ*)

$\mathcal{O}_B$

B1  $Article \equiv \exists publ.Journal$   
 $\sqcup Proceedings$

B2  $publish(ab, procXY)$

B3  $Proceedings(procXY)$

- ▶  $\mathcal{O}_A \cup \mathcal{O}_B$  is inconsistent

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- ▶ How to repair this?
  - ▶ Find all sets of culprits (Here one set:  $\mathcal{O}_A \cup \mathcal{O}_B$ )
  - ▶ If a culprit set has more than one sentence, then problem to decide which to eliminate? (Here: Eliminate A1 or ... or B3?)



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$\implies$  Research field Ontology Change (OC)

- ▶ This lecture: Research field Belief Revision (BR)
- ▶ Next lecture: Extensions of BR w.r.t. OC and OC in detail

# Belief Revision (BR)

- ▶ About 35 years aged interdisciplinary research field in philosophy, cognitive science, CS
- ▶ Landmark paper by AGM (Alchourrón, Gärdenfors, Makinson)  
**Lit:** C.E. Alchourrón, P. Gärdenfors, and D. On the logic of theory change: partial meet contraction and revision functions. *Journal of Symbolic Logic*, 50:510–530, 1985.
- ▶ BR deals with operators for revising theories under possible inconsistencies
  - ▶ Investigates concrete revision operators
  - ▶ Principles that these must fulfill
  - ▶ Representation theorems

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- ▶ BR deals with operators for revising theories under possible inconsistencies
  - ▶ Investigates concrete revision operators
  - ▶ Principles that these must fulfill
  - ▶ Representation theorems
- ▶ Recent research how to adapt these for non-classical logics/ontologies, mappings, programs.

# Terminology

- ▶ Unfortunately the **field** of Belief Revision is called after the particular class of revision operators
- ▶ But it handles other types of changing beliefs/theories: expansion, update, and contraction
- ▶ We stick to this folklore use and hide the name of the field behind the acronym BR

# AGM Postulates

# Consequence Operator

- ▶ AGM framework based on general notion of logic in polish tradition

**Lit:** R. Wójcicki. *Theory of Logical Calculi*. Kluwer Academic Publishers, Dordrecht, 1988.

## Definition (Logic in Polish Tradition)

A logic is a pair  $(\mathcal{L}, Cn)$  where

- ▶  $\mathcal{L}$ : Set of well-formed sentences
- ▶  $Cn$ : Consequence operator  $Pow(\mathcal{L}) \rightarrow Pow(\mathcal{L})$

**Note:** No distinction between syntax and semantics

# AGM Consequence Operator

## Definition (Tarskian consequence operator)

For all  $X, X_1, X_2 \subseteq \mathcal{L}$ :

1.  $X \subseteq Cn(X)$  (Inclusion)
2. If  $X_1 \subseteq X_2$ , then  $Cn(X_1) \subseteq Cn(X_2)$ . (Monotonicity)
3.  $Cn(X) = Cn(Cn(X))$  (Idempotence)

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- ▶ AGM additionally has further requirements on  $Cn$
- ▶ These lead to their well-known representation results



# AGM-Requirements for Consequence Operators

- ▶ **Language expressivity:** Language  $\mathcal{L}$  should contain all propositional connectors
- ▶ **Supra-classicality:** If  $\alpha$  can be derived from  $X$  by propositional logic then  $\alpha \in Cn(X)$
- ▶ **Compactness:** If  $\alpha \in Cn(X)$  then  $\alpha \in Cn(X')$  for some finite  $X' \subseteq X$ .
- ▶ **Deduction:**  $\beta \in Cn(X \cup \{\alpha\})$  iff  $(\alpha \rightarrow \beta) \in Cn(X)$
- ▶ **Disjunction in premisses:** If  $\gamma \in Cn(X \cup \{\alpha\}) \cap Cn(X \cup \{\beta\})$ , then  $\gamma \in Cn(X \cup \{\alpha \vee \beta\})$ .

## Definition (Belief Set)

- ▶ Belief set (BS) for  $(\mathcal{L}, Cn)$  is a set of the form  $Cn(X)$  for some  $X \subseteq \mathcal{L}$ .
- ▶  $BS_{\mathcal{L}} =$  Set of all belief sets for  $(\mathcal{L}, Cn)$

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- ▶ **Idealization** of the beliefs of a rational agent
  
- ▶ For post-AGM work on more realistic agents see, e.g.,

**Lit:** R. Wasserman. Resource bounded Belief Revision. PhD thesis, Institute for Logic Language and Information, Amsterdam, 1999.

# Elements of AGM Belief Revision

- ▶ AGM consider (inter-related) operators for changing BSs into new BSs under a single trigger sentence  $\in \mathcal{L}$
- ▶ Types of AGM change operators  $\mathcal{BS}_{\mathcal{L}} \times \mathcal{L} \rightarrow \mathcal{BS}_{\mathcal{L}}$ 
  - ▶ **Expansion**: add trigger and close up w.r.t.  $Cn$
  - ▶ **Contraction**: delete trigger from BS
  - ▶ **Revision**: add trigger and eliminate inconsistencies

## AGM Postulates for Expansion

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(Closure)

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- ▶ Postulates defined for fixed belief set  $K$ .

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### Note:

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- ▶ Postulates specify properties of intended change operator
- ▶ In general, many structurally different operators may fulfil the postulates, but ...

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- ▶ ... (E1)–(E6) are such specific that they uniquely identify  $+$

### Proposition

An operator  $+$  fulfils (E1)–(E6) iff for all  $\alpha$ :  $K + \alpha = \text{Cn}(K \cup \{\alpha\})$

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An operator  $+$  fulfils (E1)–(E6) iff for all  $\alpha$ :  $K + \alpha = \text{Cn}(K \cup \{\alpha\})$

- ▶ This is a representation result



## AGM Postulates for Contraction

(C1)  $K \div \alpha \in \mathcal{BS}_{\mathcal{L}}$  (Closure)

(C2)  $K \div \alpha \subseteq K$  (Inclusion)

(C3) If  $\alpha \notin K$ , then  $K = K \div \alpha$  (Vacuity)

(C4) If  $\alpha \notin \text{Cn}(\emptyset)$ , then  $\alpha \notin K \div \alpha$ . (Success)

(C5) If  $\alpha \in K$ , then  $K \subseteq (K \div \alpha) + \alpha$ . (Recovery)

(C6) If  $\alpha \leftrightarrow \beta \in \text{Cn}(\emptyset)$ , then  $K \div \alpha = K \div \beta$ .  
(Right) Extensionality

---

(C7)  $K \div \alpha \cap K \div \beta \subseteq K \div (\alpha \wedge \beta)$  (Conjunction 1)

(C8) If  $\alpha \notin K \div (\alpha \wedge \beta)$ , then  $K \div (\alpha \wedge \beta) \subseteq K \div \alpha$ .  
(Conjunction 2)

## AGM Postulates for Revision

(R1)  $K * \alpha \in \mathcal{BS}_{\mathcal{L}}$  (Closure)

(R2)  $\alpha \in K * \alpha$  (Success)

(R3)  $K * \alpha \subseteq K + \alpha$  (Expansion 1/Inclusion)

(R4) If  $\neg\alpha \notin K$ , then  $K + \alpha \subseteq K * \alpha$ . (Expansion 2/Vacuity)

(R5) If  $\mathcal{L} = \text{Cn}(K * \alpha)$ , then  $\neg\alpha \in \text{Cn}(\emptyset)$ . (Consistency)

---

(R6) If  $\alpha \leftrightarrow \beta \in \text{Cn}(\emptyset)$ , then  $K * \alpha = K * \beta$ .  
(Right) Extensionality

(R7)  $K * (\alpha \wedge \beta) \subseteq (K * \alpha) + \beta$  (Conjunction 1)

(R8) If  $\neg\beta \notin K * \alpha$ , then  $(K * \alpha) + \beta \subseteq K * (\alpha \wedge \beta)$ .  
(Conjunction 2)

# Levi-Identity

Revision is definable by contraction.

## Definition

Given a (contraction) operator  $\div$ , the (revision) operator  $*$  defined by the [Levi Identity](#) is:

$$K * \alpha = (K \div \neg\alpha) + \alpha$$

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## Theorem

*The operator defined by the Levi Identity fulfils (R1)–(R8) if  $\div$  fulfils (C1)–(C8).*

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# AGM Operators

## Operators for Revision and Contraction Postulates

- ▶ We still did not see concrete revision and contraction operators
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- ▶ But: Postulates are so specific that the classes can be characterised by construction principles.

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- ▶ We seek for models of Postulates (R1)–(R8) and (C1)–(C8).
- ▶ In contrast to  $+$ , the postulates do **not fix a single operator** but a **whole class**
- ▶ But: Postulates are so specific that the classes can be characterised by construction principles.
- ▶ There are various construction principles leading to different classes
  - ▶ Partial meet
  - ▶ Safe/kernel
  - ▶ Epistemic entrenchment
  - ▶ Possible worlds
  - ▶ Sphere-based
  - ▶ ...

# Remainder Set

- ▶ Main construct underlying partial meet operators
- ▶ Describe maximal possible scenarios that are compatible with the negation of the trigger

## Definition (Remainder Set Informally)

The remainder set  $X \perp \alpha$  of  $X$  by  $\alpha$  consists of all maximal subsets of  $X$  not entailing  $\alpha$ .

The sets in  $X \perp \alpha$  are called remainders.

# Remainder Set

## Definition (Remainder Set formally)

The remainder set  $X \perp \alpha$  of  $X$  by  $\alpha$  consists of all sets  $X'$  s.t.:

1.  $X' \subseteq X$ ;
2.  $\alpha \notin Cn(X')$ ;
3. There is no  $X''$ , such that  $X' \subsetneq X'' \subseteq X$  and  $\alpha \notin Cn(X'')$ .

## Example (Hansson Dynamics of Belief, Exercise 26a,f)

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- ▶  $\{p, q\} \perp (p \wedge q) = \{\{p\}, \{q\}\}$
- ▶  $\{p \vee r, p \vee \neg r, q \wedge s, q \wedge \neg s\} \perp (p \wedge q) =$   
 $\{\{p \vee r, p \vee \neg r\}, \{p \vee r, q \wedge s\}, \{p \vee r, q \wedge \neg s\},$   
 $\{p \vee \neg r, q \wedge s\}, \{p \vee \neg r, q \wedge \neg s\}\}$

# Selection Function

- ▶ Handle multiplicity of scenarios (remainder sets) with fairness condition  
     $\implies$  Apply selection function

## Definition (Selection Function)

An AGM-selection function  $\gamma : Pow(\mathcal{BS}_{\mathcal{L}}) \rightarrow Pow(\mathcal{BS}_{\mathcal{L}})$  for  $K$  fulfills for all  $\alpha$ :

1. If  $K \perp \alpha \neq \emptyset$ , then  $\emptyset \neq \gamma(K \perp \alpha) \subseteq K \perp \alpha$ ;
2.  $\gamma(\emptyset) = \{K\}$ .

- ▶ **Note:**  $\gamma$  is defined for a given  $K$

# Partial Meet

## Definition

For a selection function  $\gamma$  defined on  $K$  let:

- ▶  $K \div_{\gamma} \alpha = \bigcap \gamma(K \perp \alpha)$  (Partial meet contraction)
- ▶  $K *__{\gamma} \alpha = (K \div_{\gamma} \neg \alpha) + \alpha$  (Partial meet revision)



# Partial Meet

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For a selection function  $\gamma$  defined on  $K$  let:

- ▶  $K \dot{\div}_{\gamma} \alpha = \bigcap \gamma(K \perp \alpha)$  (Partial meet contraction)
  - ▶  $K *_{\gamma} \alpha = (K \dot{\div}_{\gamma} \neg\alpha) + \alpha$  (Partial meet revision)
  - ▶ **Maxi-Choice** = partial meet with  $|\gamma(X)| = 1$ .
  - ▶ **Full meet** = partial meet change with  $\gamma(X) = X$  (for  $X \neq \emptyset$ ).
- 
- ▶ Maxi-choice and full-meet are two extremes of partial meet change

## Properties Maxi-Choice and Full-Meet

- ▶ Maxi-choice revision is all-too deterministic: It decides the status of any sentence

### Theorem

*Let  $*_{\gamma}$  be a maxi-choice revision operator. Then, for any (!)  $\beta \in \mathcal{L}$  either  $\beta \in K *_{\gamma} \alpha$  or  $\neg\beta \in K *_{\gamma} \alpha$*

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- ▶ Full-meet revision is too skeptical.

## Theorem

Let  $*_{\gamma}$  be a full-meet revision operator. Then for all  $\alpha$  with  $\neg\alpha \in K$ :  $K *_{\gamma} \alpha = Cn(\alpha)$ .

# Representation Theorem

- ▶ The basic axioms for AGM revision and contraction characterise the class of partial meet revision and partial meet contraction operators

## Theorem

*An operator  $\div$  on belief set  $K$  fulfils (C1)–(C6) iff there is a selection function  $\gamma$  such that for all  $\alpha$ :*

$$K \div \alpha = K \div_{\gamma} \alpha$$

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$$K * \alpha = K *_{\gamma} \alpha$$

- ▶ Partial-meet operators do not necessarily fulfil the additional postulates (R7,8), (C7,8), resp.
- ▶ For this one considers  $\gamma$  with additional properties

# Representation Theorems

- ▶ Representation theorem in a general sense
  - ▶ Given a class  $A$  of structures satisfying a set of axioms
  - ▶ Output: A class of structures  $B$  (adhering to some simple construction) such that any  $A$ -structure is structure-equivalent to some  $B$ -structure
  - ▶ Different notions of structure equivalence
  - ▶ Example: Stone's result that every boolean algebra is isomorphic to an algebra of sets
  
- ▶ Representation theorems in BR are special cases
  - ▶ Domains of operators are fixed
  - ▶ Equality instead of isomorphism

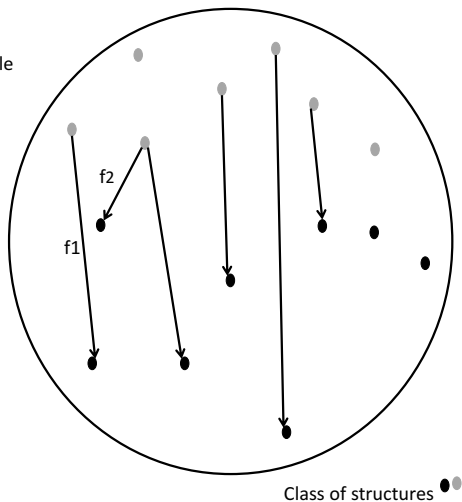
# Representation (General)

- Class of representing structures  
With simple construction principle

fi Structure preserving  
representation mappings fi

- Class of represented  
(Non-prototypical) structures

- ● Class of all structures



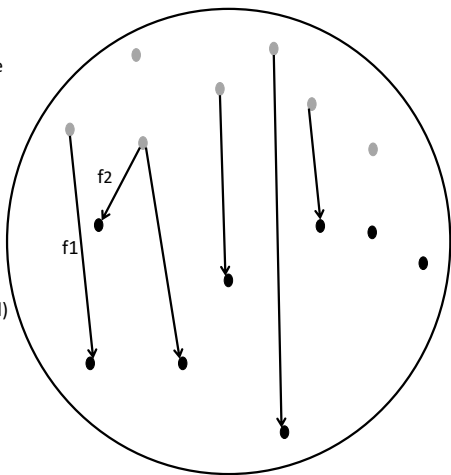
# Representation (Non-Mathematical Example)

- Class of representing structures with simple construction principle  
(VW beetle)

- fi Structure preserving mappings  
(VW beetle blueprint  $\rightarrow$  Porsche blueprint)

- Class of represented (non-typical) structures  
(Non-VW-beetle)

- ● Class of all structures  
(VW cars)





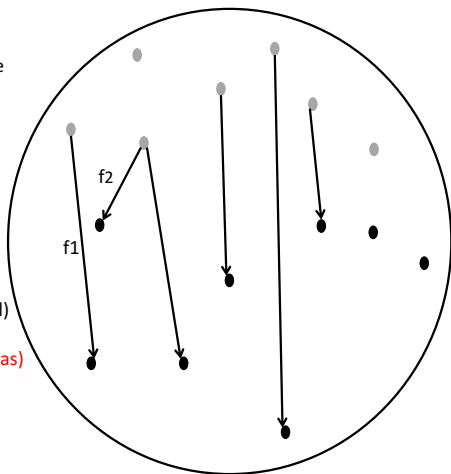
# Representation (The Classical Mathematical Example)

- Class of representing structures with simple construction principle  
(set algebras)

- fi Structure preserving mappings  
(isomorphisms  
set-algebra to Boolean algebra)

- Class of represented (non-typical) structures  
(Non-set-algebra Boolean-algebras)

- ● Class of all structures  
(Boolean algebras)



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- ▶ Kernel revision
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  - ▶ Revision: Revise by eliminating from every kernel at least one element

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  - ▶ Idea: Specify (partial) order on sentences w.r.t. a belief set
  - ▶ Revision: Eliminate the least epistemically entrenched ones

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- ▶ **Possible Worlds** (see following slides)

AGM: criticism, extensions and more

# AGM: the Core of BR Research

- ▶ AGM change operators have been criticised on different grounds—again and again
- ▶ This shows importance of AGM rather than weakness
- ▶ We discuss criticisms of AGM, extensions, and alternative operators ...
- ▶ ... mainly with respect to use of BR for CS and ontology change

# General Criticism: Recovery

Remember: If  $\alpha \in K$ , then  $K \subseteq (K \div \alpha) + \alpha$ . (Recovery)

## Example

- ▶ Belief set  $K$  contains
    - ▶ Cleopatra had a son. ( $\gamma$ )
    - ▶ Cleopatra had a daughter ( $\beta$ )
    - ▶ Cleopatra had a child. ( $\gamma \vee \beta$ )
  - ▶ Contract with  $\gamma \vee \beta$  (The  $\alpha$  in recovery postulate)
  - ▶ Then add  $\gamma \vee \beta$ .
  - ▶ Why should one still believe in facts  $\gamma$  and  $\beta$ ?
- 
- ▶ Recovery somehow wrongly implements minimality



# General Criticisms: No Minimality

## Example

- ▶ AGM postulates allow amnesic revision of form

$$K * \alpha = Cn(\alpha)$$

- ▶ This is not minimal in a genuine sense
  
- ▶ Lead to invention of relevance postulates

## Definition (Relevance Postulate Template)

Allow the elimination only of those sentences of a knowledge base that are relevant for the trigger.

## Formalizing Relevance according to (Parikh 99)

### Definition (Finest splitting of a knowledge base KB)

Finest partition  $(V_i)_{i \in I}$  of the vocabulary  $V(KB)$  of  $KB$  such that there are knowledge bases  $KB_i$  over  $V_i$  with  $KB \equiv \bigcup_{i \in I} KB_i$ .

**Lit:** R. Parikh. Beliefs, belief revision, and splitting languages. In Logic, Language and Computation, vol. 2, pages 266–278, 1999.

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## Example

- $KB = \{p \rightarrow \neg q, \neg q \rightarrow r, p \vee s, \neg s, (r \rightarrow t) \vee (t \rightarrow r)\}$ 
  - ▶  $V = V(KB) = \{p, q, r, s, t\}$
  - ▶ Coarsest partition:  $V$  taking  $I = \{1\}$ ,  $KB_1 = KB$ .
  - ▶ Finer partition:  $V_1 = \{p, q\}$ ,  $V_2 = \{r, s, t\}$  and  $KB_1 = \{p, \neg q\}$ ,  $KB_2 = \{r, \neg s\}$
  - ▶ Finest splitting:  $\{\{p\}, \{q\}, \{r\}, \{s\}, \{t\}\}$  with  $KB_1 = \{p\}$ ,  $KB_2 = \{\neg q\}$ ,  $KB_3 = \{r\}$ ,  $KB_4 = \{\neg s\}$ ,  $KB_5 = \{\}$ .
- $KB = \{(p \rightarrow \neg q) \wedge (r \rightarrow s)\}$ 
  - ▶ Finest splitting:  $\{\{p, q\}, \{r, s\}\}$  and  $KB_1 = \{p \rightarrow q\}$ ,  $KB_2 = \{r \rightarrow s\}$

# Formalizing Relevance (Parikh)

## Theorem (Parikh 1999)

*Every (finite) KB has a unique finest splitting*

## Definition (Cell-relevance)

$\alpha$  is cell-relevant for  $\beta$  modulo  $KB$  iff there is a  $V_i$  in the finest splitting of  $KB$  such that  $\alpha^*$  and  $\beta^*$  share a symbol with  $V_i$  (not necessarily the same).

( $\alpha^*$  = formula equivalent to  $\alpha$  in least-letter set for  $\alpha$ . Eg:

$$(\neg p \wedge (\neg p \vee q))^* = \neg p$$

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## Definition (Relevance postulate instance)

If  $\beta \in KB$  but  $KB * \alpha \not\models \beta$  then  $\alpha$  is cell-relevant for  $\beta$  modulo  $KB$

# Relevance

- ▶ Parikh's approach generalized to infinite bases and for FOL:  
**Lit:** D. Makinson and G. Kourousias. Parallel interpolation, splitting, and relevance in belief change. *Journal of Symbolic Logic*, 72:994–1002, September 2007.
- ▶ For a consideration of different aspects of relevance see  
**Lit:** D. Makinson. Propositional relevance through letter-sharing: review and contribution. In: *Formal Models of Belief Change in Rational Agents*, volume 07351 of Dagstuhl Seminar Proceedings, 2007.
- ▶ But there are also considerations why “dogma of minimality” is not satisfiable  
**Lit:** H. Rott. Two dogmas of belief revision. *The Journal of Philosophy*, 97(9):503–522, 2000.

# General Criticism: Success postulate

## Example

- ▶ Child: “There was a dinosaur in our flat who broke the vase”
- ▶ One wants to trust only some parts of information (a glass was broken) but not other parts (it was a dinosaur)

**Lit:** S. O. Hansson. A survey of non-prioritized belief revision. *Erkenntnis*, 50(2-3):413–427, 1999.

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- ▶ Lead to non-prioritized belief revision: no priority for trigger
- ▶ Types
  1. Revise only with credible triggers
  2. Delete elements from belief base or the trigger
  3. Delete elements from belief base or from closure of trigger
  4. Extend with trigger and then delete inconsistencies
  5. Decide which part  $f(\alpha)$  to delete from trigger

**Lit:** S. O. Hansson. A survey of non-prioritized belief revision. *Erkenntnis*, 50(2-3):413–427, 1999.



# Requirement of Finite Belief Sets

- ▶ CS cannot handle infinite belief sets
- ▶ Objects (data base, knowledge base, ontology etc.) are finite or finitely representable
- ▶ Three possible approaches
  1. Change operators for **finitely generated belief sets**  $Cn(X)$  with  $X$  finite (see textbook of Hansson)
  2. Change operators for finite **belief bases**  
Belief base = not necessarily closed subset of  $\mathcal{L}$
  3. Change operators for models of finite belief bases

# Syntax-sensitive Belief Base Revision

- ▶ Hansson's approach: use syntax sensitivity in order to represent additional justification information

## Example

- ▶  $B_1 = \{p, q\}$   
Belief in  $p$  and  $q$  with independent justifications for  $p$  and  $q$
- ▶  $B_2 = \{p \wedge q\}$   
Belief in  $p$  and  $q$  but with common justification for  $p$  and  $q$
- ▶  $B_1 \equiv B_2$
  
- ▶  $B_1 \div p$  may reasonably contain  $q$
- ▶  $B_2 \div p$  leads to  $\emptyset$

# Syntax-sensitive Belief Base Revision

- ▶ Similar constructions and postulates as in AGM
- ▶ Main difference: expansion now reads as  $B + \alpha = B \cup \{\alpha\}$

**Lit:** S. O. Hansson. A Textbook of Belief Dynamics. Kluwer Academic Publishers, 1999.

# Syntax-sensitive Belief Base Revision

- ▶ Similar constructions and postulates as in AGM
- ▶ Main difference: expansion now reads as  $B + \alpha = B \cup \{\alpha\}$
- ▶ Additional phenomena and revision operators due to handling of inconsistency
  - ▶ First prevent inconsistency then add trigger  
 $B *_{internal} \alpha = (B \div \neg\alpha) + \alpha$  (as in AGM)
  - ▶ First add trigger then handle inconsistency  
 $B *_{external} \alpha = (B + \alpha) \div \perp$  (New)

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 $B *_{external} \alpha = (B + \alpha) \div \perp$  (New)
- ▶ In-depth treatment in textbook (Hansson 99).

**Lit:** S. O. Hansson. *A Textbook of Belief Dynamics*. Kluwer Academic Publishers, 1999.

# Summary and Outlook

- ▶ Considered classical AGM theory of belief revision for handling inconsistencies
- ▶ Started discussing extensions based on criticisms of AGM in particular for use in CS applications
- ▶ Next week: continue consideration of extensions with in particular for use in ontology integration