# AGM 25 Years Twenty-Five Years of Research in Belief Change

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**Abstract** The 1985 paper by Carlos Alchourrón (1931–1996), Peter Gärdenfors, and David Makinson (AGM), "On the Logic of Theory Change: Partial Meet Contraction and Revision Functions" was the starting-point of a large and rapidly growing literature that employs formal models in the investigation of changes in belief states and databases. In this review, the first twenty-five years of this development are summarized. The topics covered include equivalent characterizations of AGM operations, extended representations of the belief states, change operators not included in the original framework, iterated change, applications of the model, its connections with other formal frameworks, computatibility of AGM operations, and criticism of the model.

**Keywords** Belief change • Belief revision • Theory change • Partial meet contraction • Partial meet revision • AGM • Carlos Alchourrón • Peter Gärdenfors • David Makinson

### **1** Introduction

Many research papers have been called "seminal", but few deserve that designation as much as the article in the Journal of Symbolic Logic in 1985 by Carlos Alchourrón (1931–1996), Peter Gärdenfors, and David Makinson,

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"On the Logic of Theory Change: Partial Meet Contraction and Revision Functions". The immediate prehistory of this article has been told previously by Makinson [189], and now also by Gärdenfors [112]. Like all major scientific achievements, that of the AGM trio was much facilitated by previous work by others. Computer scientists such as Doyle [65] and Fagin et al. [72] had developed precise models of database updating, and philosophers such as Harper [146] and in particular Levi [170, 171] had investigated philosophical issues in belief change.

The yearly number of Web of Science citations of the AGM article has increased from about 15 per in the 1990's to about 50 in the most recent years—a remarkable record for a logic paper. Its impact has been profound both among philosophers and in the artificial intelligence community [48].

It is the purpose of this review to exemplify the diversity and significance of the research that has been inspired by the AGM article. Section 2 covers some of the equivalent characterizations of the AGM model that have contributed to our understanding of it. In Section 3 we discuss some of the more common criticisms of AGM. Section 4 is devoted to extensions and variations of the belief state representation in AGM (belief sets), Section 5 to iterated change, and Section 6 to operations of change that have been introduced in addition to the three AGM operations (contraction, revision, and expansion). Section 7 provides an overview of applications and connections with other areas of research, and Section 8 summarizes some results on the computability of belief change operations.

#### 2 Equivalent Characterizations

The AGM model has been expressed in several seemingly dissimilar ways.

#### 2.1 AGM Briefly Summarized

In the basic AGM framework a person's belief state is represented by a set K of sentences that is closed under the operation Cn of logical consequence, i.e. K = Cn(K). In order to contract K by a sentence p we consider the set  $K \perp p$  of all maximal subsets of K not implying p. A selection function  $\gamma$  selects the most plausible elements of  $K \perp p$ . Whenever  $K \perp p$  is non-empty,  $\gamma(K \perp p)$  is a non-empty subset of  $K \perp p$ . The *partial meet contraction*  $\sim_{\gamma}$  based on  $\gamma$  is defined as  $K \sim_{\gamma} p = \bigcap \gamma(K \perp p)$ . In the limiting case when p is a tautology,  $K \sim_{\gamma} p = K$ . If  $\gamma(K \perp p) = K \perp p$  for all p, then  $\sim_{\gamma}$  is the *full meet contraction*, also denoted  $\sim$ . If  $\gamma(K \perp p)$  is always a singleton when  $K \perp p$  is non-empty, then  $\sim_{\gamma}$  is a *maxichoice contraction*. If there is a transitive relation  $\sqsubseteq$  such that  $\gamma(K \perp p) = \{X \in K \perp p \mid (\forall Y \in K \perp p)(Y \sqsubseteq X)\}$  for all nonempty  $K \perp p$ , then  $\sim_{\gamma}$  is *transitively relational*. There are two operations that add beliefs to a belief set:  $K + p = Cn(K \cup \{p\})$  (expansion) and  $K *_{\gamma} p = Cn((K \sim_{\gamma} \neg p) \cup \{p\})$  (revision). In the AGM article, axiomatic characterizations were provided for all these operations. These axioms are

Basic contraction postulates	Basic revision postulates
$K \div p = \operatorname{Cn}(K \div p)$ (closure)	K * p = Cn(K * p) (closure)
$K \div p \subseteq K$ (inclusion)	$K * p \subseteq K + p$ (inclusion)
If $K \nvDash p$ then $K \div p = K$ (vacuity)	If $K \nvDash \neg p$ then $K + p \subseteq K * p$ (vacuity)
If $\nvDash p$ then $p \notin K \div p$ (success)	$p \in K * p$ (success)
If $\vdash p \leftrightarrow q$ then $K \div p = K \div q$	If $\vdash p \leftrightarrow q$ then $K * p = K * q$
(extensionality)	(extensionality)
$K \subseteq (K \div p) + p$ (recovery)	If $p \nvDash \bot$ then $K * p \nvDash \bot$ (consistency)
Supplementary contraction postulates	Supplementary revision postulates
$(K \div p) \cap (K \div q) \subseteq K \div (p\&q)$ (conjunctive overlap)	$K * (p\&q) \subseteq (K * p) + q$ (superexpansion)
If $p \notin K \div (p\&q)$ then $K \div (p\&q) \subseteq K \div p$ (conjunctive inclusion)	If $K * p \nvDash \neg q$ then $(K * p) + q \subseteq K * (p \& q)$ (subexpansion)

 Table 1
 The standard AGM postulates

The six basic contraction postulates exactly characterize partial meet contraction, and all eight contraction postulates exactly characterize transitively relational partial meet contraction. Similarly, the six basic revision postulates exactly characterize partial meet revision, and all eight revision postulates exactly characterize transitively relational partial meet revision.  $X \vdash p$  is an alternative notation for  $p \in Cn(X)$  and  $\vdash p$  for  $p \in Cn(\emptyset)$ 

listed in Table 1. Subsequently, several other equivalent characterizations have been developed.

#### 2.2 Safe and Kernel Contraction

Alchourrón and Makinson proposed the operation of *safe contraction* that is based on a non-circular relation < on the elements of K. An element a of K is safe with respect to p if and only if all inclusion-minimal p-implying subsets of K either do not contain a or contain some b such that b < a. The safe contraction  $\div$  based on < yields as outcome the logical closure of the set of sentences in K that are safe with respect to p [6]. All safe contractions are partial meet contractions. Additional results on safe contraction have been obtained by Rott [225].

*Kernel contraction*, introduced in [128], is a non-relational generalization of safe contraction. Let Kp be the set of minimal p-implying subsets of K. An incision function is a function  $\sigma$  that selects sentences to be discarded. It satisfies the two basic properties (i)  $\sigma(K \perp p) \subseteq \bigcup(K \perp p)$  and (ii) if  $\emptyset \neq X \in K \perp p$ , then  $X \cap \sigma(K \perp p) \neq \emptyset$ . The kernel contraction  $\approx_{\sigma}$  based on  $\sigma$  is defined by the relationship  $K \approx_{\sigma} p = K \setminus \sigma(K \perp p)$ . The partial meet contractions on a belief set coincide exactly with the kernel contractions that satisfy the additional condition of smoothness, namely that if  $X \subseteq K$  and  $Cn(X) \cap \sigma(K \perp p) \neq \emptyset$ , then  $X \cap \sigma(K \perp p) \neq \emptyset$ .

2.3 Epistemic Entrenchment

*Epistemic entrenchment* which was introduced in [107, 113] and [109] is a binary relation  $\leq$  on the sentences in the belief set K such that in contrac-

tion, giving up beliefs with lower entrenchment is preferred to giving up those with higher entrenchment. Entrenchment is assumed to satisfy transitivity, dominance (if  $p \vdash q$  then  $p \leq q$ ), conjunctiveness (either  $p \leq p\&q$  or  $q \leq p\&q$ ), minimality (non-elements of K are the sentences with minimal entrenchment) and maximality (tautologies are the sentences with maximal entrenchment). Entrenchment-based contraction is constructed such that for all non-tautologous  $p: K \div p = \{q \in K \mid q . A contraction operator is an entrenchment-based contraction if and only if it is a transitively relational partial meet contraction. Rott has investigated similar operations that are based on entrenchment relations satisfying various weaker sets of conditions [230, 232]. Other results on entrenchment have been obtained in [78, 199] and elsewhere.$ 

Alternatively, a contraction operator can be defined as follows:  $K \div p = \{q \in K \mid q < p\}$ . This is severe withdrawal (also called mild contraction or Rott's contraction). It was axiomatized independently by Pagnucco and Rott [237] and by Fermé and Rodriguez [86]. Arló-Costa and Levi have analyzed it in terms of minimal loss of informational value [12]. It has been shown to satisfy the implausible postulate of expulsiveness. (If  $\nvdash p$  and  $\lor q$ , then either  $p \notin K \div q$  or  $q \notin K \div p$ ) [133]. However, Lindström and Rabinowicz have proposed that the truth lies somewhere between severe withdrawal and the originally proposed entrenchment-based contraction [177]. This has been called Lindström's and Rabinowicz's interpolation thesis [228].

#### 2.4 Grove's Spheres

In Grove's possible world-modelling of belief revision, each logically closed set X is represented by the set [X] of possible worlds including it, and similarly each sentence p is represented by the set [p] of possible worlds including it [117]. The expansion outcome K + p will then be represented by the set  $[K + p] = [K] \cap [p]$ , and a contraction outcome  $K \div p$  by some superset  $[K \div p]$  of [K] that includes at least one  $\neg p$ -world. The most remarkable result in this framework is the equivalence between transitively relational partial meet operations and operations based on a *sphere system* around the belief set. Let  $S_1, S_2...$  be sets of possible worlds such that  $[K] \subset S_1$  and  $S_k \subset S_{k+1}$  for all k. The contraction  $\div$  is a sphere-based contraction on K if and only if it holds for all p that  $[K \div p]$  is the set of worlds obtained by adding to [K] all the  $\neg p$ -worlds in the smallest sphere  $S_k$  that has any  $\neg p$ -world. Sphere-based contraction coincides with transitively relational partial meet contraction (and thus with entrenchment-based contraction). It has been used for instance in analyses of iterated belief change [235].

Booth et al. have proposed a model of belief change that makes use of two relations  $\leq$  and  $\preccurlyeq$  on possible worlds, instead of only one as in the standard Grove model. Both relations represent plausibility, and  $\preccurlyeq$  is a reflexive subrelation of  $\leq$  [35].

# 2.5 Distance Models

Several authors have proposed models of belief change that employ representations of similarity or distance. In [125] some variants of AGM contraction operators were reconstructed in terms of a mechanism that selects those among the eligible belief sets that are closest to the original belief set. Katsuno and Mendelzon have shown how AGM revision can be reconstructed in terms of a closeness relation that is used to ensure that changes are minimal [155]. Lehmann, Magidor and Schlechta have obtained close connections between partial meet revision and models employing what they call pseudo-distances, a generalization of the common notion of a distance [168].

# 2.6 Specified Meet Contraction

A belief set *K* is finite-based if there is some finite set *S* of sentences such that Cn(K) = Cn(S). In a cognitively realistic model, we can expect the original belief set to be finite-based, and the contraction operator should satisfy the following postulate:

*Finite-based outcome:* If *K* is finite-based, then so is  $K \div p$ .

Not all partial meet contractions satisfy Finite-based outcome. Those that do so have been shown to be reconstructible as *specified meet contractions*. A specified meet contraction is defined by the relationship  $K \div p = K \sim f(p)$ , where  $\sim$  is full meet contraction and f is a function from and to the language. Intuitively, f(p) is the sentence that is really removed in order to contract by p. (Hence if we remove only q in order to contract by q&r then we can have f(q&r) = q.) Various axioms for contraction, including the standard AGM postulates, have been shown to correspond exactly to some property of the sentential selector f [137, 138].

# **3** Criticism of the Model

Much of the critical discussion on the AGM model has referred either to the postulates for partial meet contraction and revision (Sections 3.1 and 3.2) or to the use of belief sets to represent belief states (Sections 3.3 and 3.4).

On philosophical issues relating to AGM see also [135] and [230].

3.1 The Recovery Postulate

By far the most criticized of the postulates is one of the basic postulates for contraction:

*Recovery:* 
$$K \subseteq (K \div p) + p$$
.

Recovery is based on the intuition that we get all of the beliefs back after first contracting and then expanding by the same belief [106]. However, counterexamples have been constructed in which the recovery postulate seems to give rise to implausible results. Suppose for instance that your original belief set K contained the belief s that Cleopatra had a son. You receive information that makes you contract the belief that she had a child ( $s \lor d$ , where d denotes that she had a daughter). You will then arrive at a belief set  $K \div (s \lor d)$ , and clearly  $s \notin K \div (s \lor d)$ . Now suppose that you receive more reliable information that makes you expand your belief set by  $s \lor d$ . We can then expect to have  $s \notin K \div (s \lor d) + (s \lor d)$ , contrary to Recovery [121]. In a retort, Makinson argued that the theories considered in this and similar examples are implicitly "clothed" with additional justificational structure. In his view, Recovery remains appropriate for "naked", logically closed theories [187]. In a somewhat similar vein, Glaister argued that this contraction is better represented by a multiple contraction than by a contraction by  $s \lor d$  [115].

Belief base models do not in general satisfy Recovery. (See Section 4.1.) In Makinson's terminology, operations that satisfy the other five basic contraction postulates but not Recovery are called withdrawals [185].

3.2 The Success Postulates

Partial meet revision satisfies the following postulate:

*Revision success:* 
$$p \in K * p$$

Several authors have found this to be an implausible feature of belief revision, even if p is not a contradiction [55, 132]. Similarly, one of the AGM postulates for partial meet contraction:

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Contraction success: If \nvDash p, then p \notin K \div p.
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has been contested on the ground that there may be sentences other than tautologies that an epistemic agent may refuse to withdraw [226]. Operations have been proposed that violate these two postulates. (See Section 6.2)

3.3 Are Belief Sets Too Large?

The use of a logically closed belief set to represent the belief state implies that all beliefs are treated as if they have independent status. Suppose that you believe that you have your keys in your pocket (p). It follows that you also believe that either you have your keys in your pocket or the archbishop of York is a quranist muslim  $(p \lor q)$ . However,  $p \lor q$  has no independent standing; it is in the belief set only because p is there. Therefore, if you give up your belief in p we should expect  $p \lor q$  to be lost directly, without the need for any mechanism to deselect it. In the AGM framework, however, "merely derived" beliefs such as  $p \lor q$  have the same status as independently justified beliefs such as p. Belief base models (to be discussed in Section 4.1) have largely been constructed in order to make this distinction. Rott has pointed out that the logical closure of belief sets is unrealistic since it assumes that epistemic agents are ideally competent concerning logic [230]. In the same article he argued that contrary to common assumptions, AGM is not based on a principle of minimal change.

Since actual human agents have finite minds, a good case can be made that a cognitively realistic model of belief change should be finitistic, and this in two senses. First, both the original belief set and the belief sets that result from a contraction should be finite-based, i.e. obtainable as the logical closure of some finite set. Secondly, the outcome set, i.e. the class of belief sets obtainable by contraction from the original belief set  $({X | (\exists p)(X = K \div p)})$ should be finite [127]. Partial meet contraction does not in general satisfy either of these two finitistic criteria. This has led to the development of finitistic models such as belief base models (Section 4.1) and specified meet contraction (Section 2.6).

#### 3.4 Lack of Information in the Belief Set

Belief sets have also been criticized for lacking important information. Most importantly, AGM contraction or revision in its original form is a "one shot" operation. After contracting K by p with the operation  $\sim_{\gamma}$  we obtain a new belief set  $K \sim_{\gamma} p$  but no new selection function to be used in further operations on this new belief set. In other words the original AGM framework does not satisfy the principle of *categorial matching*, according to which the representation of a belief state after a change should have the same format as that of the belief state before the change [114]. In studies of iterated revision, various ways to extend the belief state representation to solve this problem have been investigated. (See Section 5.)

The lack of modal and conditional sentences in belief sets has often been pointed out, but attempts to include them have given rise to severe difficulties. The same applies to introspective beliefs, i.e. the agent's beliefs about her own belief state [91]. The inclusion of sentences referring to preferences and norms has been somewhat more successful. (See Section 7.9.)

#### 4 Extended Representations of Belief States

Many of the modifications of the AGM model that have been proposed consist in extensions of the belief state representation that make it contain more information in addition to what is contained in the belief set.

#### 4.1 Belief Bases

A belief base is a set *B* of sentences such that a sentence *p* is believed if and only if  $p \in Cn(B)$  [184, p. 357]. Operations on belief bases have been extensively investigated [56, 77, 93, 95, 119, 120, 123, 129, 201, 229, 264].

There are two major interpretations of belief bases. One of them, supported by Dalal [56], uses belief bases as mere expressive devices; hence if  $Cn(B_1) = Cn(B_2)$  then  $B_1$  and  $B_2$  represent the same belief state and yield the same outcome under all operations of change. ("Irrelevance of syntax", see [202].)

The other, more common approach treats inclusion in the belief base as epistemically significant. The belief base contains those sentences that have an epistemic standing of their own. Suppose that the belief set contains the sentence s, "Shakespeare wrote Hamlet". Due to logical closure it then also contains the sentence  $s \lor d$ , "Either Shakespeare wrote Hamlet or Charles Dickens wrote Hamlet". The latter sentence is a "mere logical consequence" that should have no standing of its own [136]. In this approach, belief bases increase the expressive power of the belief representation, since two belief bases with the same logical closure can represent different ways to hold the same beliefs. The two belief bases  $\{p, q\}$  and  $\{p, p \leftrightarrow q\}$  have the same logical closure but will expectedly behave differently under operations of change; revision by  $\neg p$  will result in  $\{\neg p, q\}$  respectively  $\{\neg p, p \leftrightarrow q\}$  [122]. In this model, changes are made on the belief base, and the merely derived sentences cannot survive when the basis of their derivation is lost. (This has been called a *filtering condition* [95].)

An input-driven operation  $\circ$  on a belief base *B* gives rise to a *base-generated* operation  $\circ'$  on K = Cn(B), such that  $K \circ' p = Cn(B \circ p)$  for all *p*. Axiomatic characterizations have been obtained of partial meet contraction and revision on belief bases [122, 126] and of the base-generated operations that they give rise to on belief sets [127]. Kernel contraction turns out to be a more general operation than partial meet contraction when applied to belief bases [73, 128].

Belief bases make it possible to distinguish between different inconsistent belief states. This can be used to construct two types of revision operators, depending on whether the negation of the added sentence is contracted before or after its addition:

$$B * p = B \div \neg p + p$$
 (internal revision, Levi identity) [4]  
 $B * p = B + p \div \neg p$  (external revision, reversed Levi identity) [127]

The recovery postulate does not hold for partial meet contraction on belief bases [121]. Johnson and Shapiro have investigated conditions under which Recovery, or closely related properties, hold in belief base contraction, and argued for the plausibility of some of these conditions [153].

Nebel has proposed belief base operations in which a complete, reflexive and transitive relation over the elements of the belief base is used to prioritize among its elements [202]. This approach was further developed by Weyderts [266].

Epistemic entrenchment cannot be straightforwardly transferred to a belief base framework. However, Williams showed how contraction can be based on ensconcement relations, a related type of transitive and connective relation on belief bases [269]. On ensconcement, see also [83]. Di Giusto and Governatori have developed an approach in which the elements of the belief base are divided into two categories, facts and rules. Facts are removed if necessary to accommodate new facts. Rules are not removed but can instead be changed. Hence, suppose that the belief base contains the fact a&b and the two rules  $a \to c$  and  $b \to c$ . After revision by the new fact  $\neg c$ , a new belief base is obtained that contains the facts a&b and  $\neg c$  and the two rules  $(a\&\neg b) \to c$  and  $(b\&\neg a) \to c$  [64].

Bochman has developed a theory of belief revision in which an epistemic state is represented by a triple  $\langle S, \langle , l \rangle$ , where S is a set of objects called admissible belief states,  $\langle a$  strict preference relation on these states, and l a function that assigns a (logically closed) belief set to each element of S. One and the same belief set may be assigned to several elements of S. This structure shares many features with belief bases [27].

It is commonly assumed that the belief base approach corresponds to foundationalist epistemology, whereas the original AGM framework represents a coherentist view [110, 255]. Doyle accepted this view but argued that the epistemic concern for conservatism that underlies the coherentist view applies equally to the foundations approach [66]. In [143] it was argued that the original AGM approach is incompatible with important characteristics of coherentism. In [134] coherentism was expressed in a framework where a belief base *B* is assigned to the belief set *K*. Then a logically closed subset *K'* of *K* is coherent if and only if there is some sentence *p* such that  $K' = Cn(B \sim_{\gamma} p)$ .

#### 4.2 Probability and Plausibility

The AGM model represents features of doxastic behaviour that differ from those represented by probabilistic models. The degrees of belief represented for instance by entrenchment relations do not coincide with probabilities [234]. It seems difficult to construct a reasonably manageable model that covers both the logic-related and the probabilistic properties of belief change [165, 183].

However, some authors have explored the interrelations between the two types of models. Lindström and Rabinowicz showed how belief revision can be connected with accounts of conditional probability that allow the condition to have probability zero [176]. Makinson further investigates this and other connections between the two frameworks [191]. Insights from AGM can be used as an impetus for considering accounts of conditional probability in which p(q, r), the probability of q given r, is not defined in the standard way. Furthermore, the notion of non-prioritized revision (see Section 6.2) can be transferred to a probabilistic context where it corresponds to "vacuous" conditionalizing when the condition is too unbelievable to be taken seriously.

Bonanno introduced what he called the qualitative Bayes rule, namely that "... if at a state the information received is consistent with the initial beliefs—in the sense that there are states that were considered possible initially and are compatible with the information—then the states that are considered possible according to the revised beliefs are precisely those states." [30]. He constructed and characterized a model of belief revision that satisfies this condition. It complies with the AGM postulates for partial meet revision.

Friedman and Halpern have developed a model based on a notion of plausibility that is a generalization of probability. Instead of assigning to each set A of sentences a number  $\mathfrak{p}(A)$  in [0, 1], representing its probability, they assign to it an element Pl(A) of a partially ordered set. Pl(A) is called the "plausibility" of A. If  $Pl(A) \leq Pl(B)$  then B is at least as plausible as A. A sentence p is believed if and only if p is more plausibility ordering. Conditions on such changes have been identified that produce a revision operator that is essentially equivalent with partial meet revision [90, 92].

Several other authors have presented probability-based and plausibilitybased belief revision models that have close connections with the AGM model [10, 13, 18, 69].

#### 4.3 Ranking Models

In Spohn's ranking theory of belief change a belief state is represented by a ranking function  $\kappa$  that assigns a non-negative real number to each possible world w, representing the agent's degree of disbelief in w [249– 251]. A sentence p is is assigned the value  $\kappa(p) = min\{\kappa(w) \mid p \text{ holds in } w\}$ . Furthermore, p is believed if and only if  $\kappa(\neg p) > 0$ , i.e., if and only if every  $\neg p$ -world is disbelieved to a non-zero degree. The conditional rank of q given p is  $\kappa(q \mid p) = \kappa(p\&q) - \kappa(p)$ . For any sentence p and number x, the  $p \rightarrow x$ conditionalization of  $\kappa$  is defined by:  $\kappa_{p\rightarrow x}(q) = min\{\kappa(q \mid p), \kappa(q \mid \neg p) + x\}$ 

Contractions, expansions and revisions can all be represented as conditionalizations (depending on the numerical values involved). In addition, other operations such as the strengthening or weakening of beliefs already held are straightforwardly representable in this framework. Important results on belief revision based on ranking functions, including an axiomatic representation that clarifies their relationship to AGM operations, have been reported by Hild and Spohn [147]. A generalization of Spohn's ranking functions has been proposed by Weydert [267].

#### 4.4 Extensions of the Language

Belief revision theory has primarily been concerned with belief states and inputs expressed in terms of classical sentential (truth-functional) logic. The inclusion of non-truthfunctional expressions into the language has interesting and often surprisingly drastic effects.

Among the several formal interpretations of non-truthfunctional *conditionals*, such as counterfactuals, the Ramsey test is particularly well suited to belief revision. The basic idea is that "if p then q" is taken to be believed if and only if q would be believed after revising the present belief state by p. Let  $p \Box \rightarrow q$  denote "if p then q", or more precisely: "if p were the case, then q would be the

case". The Ramsey test says that  $p \Box \rightarrow q$  holds if and only if  $q \in K * p$  [253]. In order to treat conditional statements like  $p \Box \rightarrow q$  on par with statements about actual facts, they will have to be included in the belief set when they are assented to by the agent, thus:  $p \Box \rightarrow q \in K$  if and only if  $q \in K * p$ .

However, inclusion in the belief set of conditionals that satisfy the Ramsey test requires radical changes in the logic of belief change. Hence, contraction cannot then satisfy the inclusion postulate  $(K \div p \subseteq K)$  since contraction typically provides support for conditional sentences that were not supported by the original belief state. If I give up my belief that John is mentally retarded, then I gain support for the conditional sentence "If John has lived 30 years in London, then John understands the English language" [124].

A famous impossibility theorem by Gärdenfors shows that the Ramsey test is incompatible with a set of plausible postulates for revision [108]. The crucial part of the proof consists in showing that the Ramsey test implies the following monotonicity condition: If  $K \subseteq K'$  then  $K * p \subseteq K' * p$ . This condition is incompatible with the AGM postulates for revision, and it is also easily shown to be implausible. Let *K* be a belief set in which you know nothing specific about Ellen and K' one in which you know that she is a lesbian. Let *p* denote that she is married and *q* that she has a husband. Then we can have  $K \subseteq K'$  but  $q \in K * p$  and  $q \notin K' * p$ .

Several solutions to the impossibility theorem have been put forward. One option is to reject the Ramsey test as a criterion for the validity of conditional sentences [222]. Another, proposed by Levi, is to accept the test as a criterion of validity but deny that such conditional sentences should be included in the belief set when they are valid [172]. Levi and Arló-Costa have investigated a weaker version of the Ramsey test that is not blocked by Gärdenfors's result and is also compatible with the AGM model [9, 11]. In a somewhat similar vein, Lindström and Rabinowicz have proposed that a conditional sentence expresses a determinate proposition about the world only relative to the subject's belief state. Given a conditional statement  $p \Box \rightarrow q$  and a belief set K, there is some sentence  $r_{p\square \to q}^K$  such that  $p \square \to q$  holds in the belief state represented by K if and only if  $r_{p\square \rightarrow q}^{K} \in K$ . In this way we can have the Ramsey test in the following form that is not blocked by the impossibility result [178, 179]:  $r_{p_{\Box} \to q}^{K} \in K$  if and only if  $q \in K * p$ . Yet another option is to accept both the Ramsey test and the inclusion of conditional sentences into the belief set. Then belief sets containing  $\Box \rightarrow$  will behave very differently under operations of change than the common AGM belief sets, and the standard AGM postulates will not hold [124, 223]. Ryan and Schobbens have related the Ramsey test to update rather than revision (cf. Section 6.1) and found the test to be compatible and indeed closely connected with update operators [238].

Kern-Isberner has proposed a framework in which conditional sentences can be elements of belief sets, and revisions can be performed with conditional sentences as inputs [158]. A partly similar approach has been developed by Weydert [268].

The inclusion of *modal sentences* in belief sets has been investigated by Fuhrmann. Let  $\diamond p$  denote that p is possible, and let  $\diamond p \in K$  hold if and only if  $\neg p \notin K$ . This seemingly reasonable definition gives rise to problems similar to those exhibited in Gärdenfors's theorem, and essentially the same types of solutions have been discussed [94].

Lindström and Rabinowicz have investigated the inclusion into a belief revision framework of *introspective beliefs*, i.e. allowing for  $\mathbb{B}p \in K$ , where  $\mathbb{B}p$  denotes "I believe p". Paradoxical results not dissimilar to those for conditionals are obtained in this case as well [180]. Similar results were obtained by Friedman and Halpern [91].

Dupin de Saint-Cyr and Lang introduced *temporally labelled sentences* into belief revision and proposed a belief change operator, called belief extrapolation, in which predictions are based on initial observations and a principle of minimal change [70]. Bonanno has developed logics that contain both a next-time temporal operator and a belief operator [31, 32].

Booth and Richter have developed a model of fuzzy revision on belief bases. In this model, both the elements of the belief base and the input formulas come attached with a numerical degree [42].

Finally, Fuhrmann has generalized partial meet operations to *arbitrary collections of (not necessarily linguistic) items* that have a dependency structure satisfying the Armstrong axioms for dependency structures in database relationships [96, 99].

#### 4.5 Changes in Norms, Preferences, Goals, and Desires

*Norms* Although the AGM model was partly the outcome of attempts to formalize changes in norms [5], authors who tried to apply the AGM model to norms have found it in need of rather extensive modifications to make it suitable for that purpose. Boella et al. analyzed normative change in a framework with norms represented by sets of pairs  $\langle p, q \rangle$ , to be read "if p, then it is obligatory that q". In this framework, close analogues of the AGM postulates give rise to inconsistency [29]. Governatori and Rotolo proposed a model for changes in legislation that among several other aspects also includes an explicit representation of time in order to account for phenomena such as retroactivity [116]. Hansson and Makinson investigated the relationship between changes and applications of a norm system. In order to apply a norm system with conflicting norms to a particular situation, some of the norms may have to be ignored. The problem of how to prioritize among conflicting items is similar to the selection of sentences for removal [142].

*Preferences* A model of changes in preferences can be obtained by replacing the standard AGM language by sentences of the form  $p \ge q$  ("p is at least as good as q") and their truth-functional combinations. The acquisition of a new preference takes the form of revision by such a preference sentence. Partial meet contraction can be used, but some modifications of the AGM model seem to be necessary in applications to preferences [118, 130, 166].

*Goals and Desires* Intention selection is a process aimed at removing contradictions, to end up with a consistent set of intentions [208]. Paglieri and Castelfranchi have proposed a model of Data-oriented Belief Revision (DBR) in which attention is paid to the mutual influences between beliefs and goals [49–52, 207]. Boella et al. have also analyzed the role of goals in belief revision [28]. Their model is similar to DBR in its selection criteria, but it puts more emphasis on avoiding wishful thinking.

#### **5 Iterated Change**

An AGM contraction or revision takes us from a belief set to a new belief set. In doing this, it makes use of a selection mechanism such as a selection function or an entrenchment relation. However, it does not provide a new selection mechanism to be used for further changes of the new belief set. The problem of constructing models that allow for iterated change is probably the most studied problem in the literature on belief change.

5.1 Revising Epistemic States

In order to solve the problem of iterated change we need a belief state representation that contains more information than the belief set, so that it can guide additional changes. Furthermore, the operation of change has to yield a complete such belief state representation as its outcome, not merely a new belief set. There are several ways to represent such an extended epistemic state. The most common of these is a preorder on the set of possible worlds, or equivalently a complete sphere system (cf. Section 2.4). The belief set can be inferred from this preorder; it is simply the intersection of the worlds in the highest equivalance class (the innermost sphere). An operation of change gives rise to a new preorder (sphere system), from which the new belief set can be inferred, and which can in its turn be subject to further changes, etc.

The most influential formulation of this approach is due to Darwiche and Pearl [57]. To present it, let  $\Psi$  be the current belief state of the agent, and  $\leq_{\Psi}$ the preorder that represents it. Similarly, let  $\Psi \circ p$  be the belief state obtained after revising by p, and  $\leq_{\Psi \circ p}$  the preorder that represents it. (Following tradition we will focus on revision; relatively little has been written on iterated contraction.)

Darwiche and Pearl proposed the following conditions for iteration ( $\mu$  and  $\phi$  are possible worlds):

(*DP1*): For any  $\mu \vDash p$  and  $\phi \vDash p$ ,  $\mu \preceq_{\Psi} \phi$  iff  $\mu \preceq_{\Psi \circ p} \phi$ . (*DP2*): For any  $\mu \vDash \neg p$  and  $\phi \vDash \neg p$ ,  $\mu \preceq_{\Psi} \phi$  iff  $\mu \preceq_{\Psi \circ p} \phi$ . (*DP3*): For any  $\mu \vDash p$  and  $\phi \vDash \neg p$ , if  $\mu \prec_{\Psi} \phi$ , then  $\mu \prec_{\Psi \circ p} \phi$ . (*DP4*): For any  $\mu \vDash p$  and  $\phi \vDash \neg p$ , if  $\mu \preceq_{\Psi} \phi$ , then  $\mu \preceq_{\Psi \circ p} \phi$ .

According to (DP1), the order among the *p*-worlds remains unchanged after revision by *p*. According to (DP2) the order among the  $\neg p$ -worlds remains

unchanged after revision by p. (DP3) says that if a p-world is strictly preferred to a  $\neg p$ -world, then that strict preference is maintained after revision by p. (DP4) says that if a p-world is weakly preferred to a  $\neg p$ -world, then that weak preference is maintained after revision by p.

These conditions have been shown to correspond to the following postulates for iterated revision: [57, Theorem 13.]

(DP1) If 
$$q \vdash p$$
, then  $(\Psi \circ p) \circ q = \Psi \circ q$ .  
(DP2) If  $q \vdash \neg p$ , then  $(\Psi \circ p) \circ q = \Psi \circ q$ .  
(DP3) If  $\Psi \circ q \vdash p$ , then  $(\Psi \circ p) \circ q \vdash p$ .  
(DP4) If  $\Psi \circ q \nvDash \neg p$ , then  $(\Psi \circ p) \circ q \nvDash \neg p$ 

These four postulates have become the benchmark for iterated revision, and new proposals are almost invariably compared to them. However, Jin and Thielscher [149] and Booth and Meyer [37] have pointed out that these postulates are too permissive since they do not rule out operators by which all newly acquired information is given up as soon as an agent learns a fact that contradicts some of its current beliefs. To avoid this they proposed the following additional condition:

(*Ind*): For any 
$$\mu \vDash p$$
 and  $\phi \vDash \neg p$ , if  $\mu \preceq_{\Psi} \phi$ , then  $\mu \prec_{\Psi \circ p} \phi$ .

5.2 Major Classes of Iterable Operators

In a model of iterated belief revision there may be more than one way to arrive at one and the same belief set. Does it make any difference for further changes how we arrive at it? We can divide iterable operators into three classes according to their ability to remember and to take the revision history into account:

*Operators Without Memory* In this case, each belief set is revised in a predetermined way, independently of how it was obtained, i.e.:

If  $\Psi \circ p$  and  $\Upsilon \circ p$  have the same belief set, then so have  $\Psi \circ p \circ r$  and  $\Upsilon \circ p \circ r$ .

Full meet revision is a trivial example of an iterable operator without memory. Areces and Becher have analyzed this class of operators [8].

*Operators with Full Memory* In this case the full history of changes is conserved, so that rollbacks of previous changes are possible. Operators with full memory have been proposed, for example, by Brewka [46], by Lehmann [169], and by Konieczny and Pérez [160]. Falappa et al. proposed another type of revision in which discarded beliefs can be reused [74].

*Operators with Partial Memory* In this case it makes a difference for future revisions how a belief set was arrived at, but the information remembered is

not sufficient to identify the previous states. Most of the proposed iterable revision operators are of this type. In a recent review Rott recognized three major types of iterable revision operators. They all have partial memory [235]:

Conservative revision, originally called natural revision, has been studied by Boutilier [44, 45] and Rott [233]. This operation is conservative in the sense that it only makes the minimal changes of the preorder that are needed to accept the input. In revision by p, the maximal p-worlds are moved to the top of the preorder which is otherwise left unchanged. The main characteristic of this operator is:

(*Nat*): If 
$$\mu \notin [\Psi \circ p]$$
 and  $\phi \notin [\Psi \circ p]$ , then  $\mu \preceq_{\Psi} \phi$  iff  $\mu \preceq_{\Psi \circ p} \phi$ .

*Moderate revision*, also called lexicographic revision, was originally studied by Nayak [198] and by Nayak et al. [200]. When revising by p it rearranges the preorder by putting the p-worlds at top (but conserving their relative order) and the  $\neg p$ -worlds at bottom (but conserving their relative order). It has the following property.

(*Lex*): If 
$$\mu \vDash p$$
 and  $\phi \vDash \neg p$ , then  $\mu \prec_{\Psi \circ p} \phi$ .

*Radical revision* is similar to moderate revision, but it differs in making the new belief irrevocable, i.e., impossible to remove. Segerberg proposed this type of revision and characterized it axiomatically [246]. It is further investigated in [80]. In radical revision by p, the relative order of the p-worlds is retained whereas the  $\neg p$ -worlds are removed from the preorder, thus becoming inaccessible. The main characteristic of this operator is:

(*Irr*): 
$$[(\Psi \circ p) \circ \neg p] = \emptyset$$
.

Delgrande, Dubois and Lang argue that since revision assumes a static world, there is no reason why the outcome of an iterated revision should depend on the order of the inputs. Therefore, they propose that iterated revision should take the form of *prioritized merging*, a special case of multiple revision [61]. Several other types of iterable operators have been proposed, see for instance [34, 41, 47, 151, 159, 204].

# **6 Alternative Operators of Change**

In the original AGM model there are three major types of operators: contraction, revision, and expansion. Subsequently a large number of additional types of operators have been proposed.

# 6.1 Update

In 1992, Katsuno and Mendelzon presented a type of operator of change that they called update. Katsuno and Mendelzon [156] whereas revision operators are suited to capture changes that reflect evolving knowledge about a static

situation, update operators are intended to represent changes in beliefs that result from changes in the objects of belief [272]. There are important formal differences between update and AGM revision; in particular the AGM postulate Vacuity (If  $K \nvDash \neg p$  then  $K + p \subseteq K * p$ ) does not hold for updates. Update and its relation with revision have been further studied by Becher [23] and others.

### 6.2 Non-prioritized Change

In AGM revision, new information has primacy. According to the success postulate for revision, the system has total trust in the input information, and previous beliefs are discarded whenever that is needed to consistently incorporate the new information. This is an unrealistic feature since in real life, cognitive agents sometimes do not accept the new information that they receive. Belief revision that violates the success postulate is called non-prioritized belief revision. Revision operators can be classified according to their outcomes into the following five categories, of which the first is prioritized and the other four non-prioritized [79]. We assume that the input sentence p is consistent.

All. The input is accepted without any constraint:  $p \in K \circ p$ . Satisfied by AGM revision, external revision [126], and update [156].

All or nothing. Either the new input is accepted, or the belief set is left unchanged:  $p \in K \circ p$  or  $K \circ p = K$ .

Satisfied by screened revision [188], credibility-limited revision [141], and some applications of an improvement operator [161].

All or inconsistency. The input is accepted, but its negation may survive in the belief set:  $p \in K \circ p \neq Cn(\{\bot\})$  or  $K \circ p = Cn(\{\bot\})$ .

Satisfied by irrevocable belief revision [242] and also by revision by comparison in the collapsed case [88].

All or less. Either the input is accepted or it induces a contraction process:  $p \in K \circ p$  or  $K \circ p \subseteq K$ .

Satisfied by semi-revision [131] and revision by comparison in the unsuccessful case [88].

All or a part. Either the whole input or a part of it is accepted. There is then some q such that  $K * p \vdash q, \vdash p \rightarrow q$  and K \* p = K \* q.

Satisfied by selective revision [81], Rabinowicz's and Schlechta's revision [216, 241], and Lin's revision [174].

For an overview with emphasis on 'all or nothing' constructions, see [132].

The success postulate for contraction requires that all non-tautological beliefs are retractable. This is not a fully realistic requirement, since actual agents are known to have beliefs of a non-logical nature that nothing can bring them to give up. In *shielded contraction*, the success postulate does not hold in general; some non-tautological beliefs are shielded from contraction and

cannot be given up. Shielded contraction has close connections with credibilitylimited revision [82, 84, 188].

Chopra, Ghose and Meyer have extended the framework of non-prioritized belief revision by introducing non-beliefs as possible inputs that are ranked along with beliefs [53].

# 6.3 Changes in the Strength of Beliefs

An operation of change can raise or lower the position of a sentence in the ordering without affecting the belief set (but affecting how the belief state responds to new inputs). Hence an operator of improvement, as proposed by by Konieczny and Pérez [161] increases the plausibility of p by moving some of the p-worlds to a higher position in the preorder. This can facilitate the acceptance of p in later, additional operations, so that we can have  $p \notin K \circ p$  but  $p \in K \circ p \circ p$ .

In quantitative theories of belief change, such as probabilistic and ranking theories, the degree of acceptance of each sentence is represented by a numerical value. However, the meaning of these numbers is not entirely clear (especially not for non-probabilistic functions), and real agents are notoriously bad at reasoning with them [154]. These difficulties are largely avoided if an operation of change is constructed to adjust the position of an input sentence in a ordering to be the same as that of a reference sentence. Since two sentences are involved, Rott called such operators two-dimensional [235]. This kind of operation was studied by Cantwell, who introduced the operations of raising and *lowering*, whereby the degree of plausibility required for a sentence to be included into the belief set is changed in either direction [47]. Fermé and Rott proposed the operation of revision by comparison. It accepts the input sentence p to the same degree as a previously believed sentence q, unless the negation of the input sentence p is more plausible than the reference sentence q, in which case q will be removed from the outcome [88]. Revision by comparison violates the DP postulates since it collapses distinctions between some  $\neg p$ -worlds. Rott has proposed a variant, bounded revision, that captures the spirit of revision by comparison and also satisfies the DP postulates [236].

# 6.4 Resource-bounded Change and Inconsistency Management

AGM is a theory of changes of beliefs undertaken by highly idealized reasoners with unlimited cognitive capacities. In contrast, real reasoners such as humans, computers, and robots have limited resources. As was noted by Wassermann, it is important to distinguish between a limited implementation of a theory for ideal reasoning, and a theory for reasoners with limited resources [264]. Harman has put forward a highly useful list of principles that should be valid for any resource-bounded agent [145]. As was observed by Gabbay and Hunter, for a real agent it may not be necessary to restore consistency, but it may be sufficient to have rules that specify how to act when an inconsistency arises [101]. The two features of resource-boundedness that have attracted

most attention among researchers are finitude and inconsistency tolerance. Both belief bases and specified meet contraction have been constructed largely in order to avoid the infinite structures of the standard AGM model.

Doyle has investigated characteristics of real agents such as mental inertia and constitutional elasticity [67]. His *reason maintenance system* (RMS) is intended to capture these characteristics. Alechina et al. used RMS to construct a resource-bounded operator of contraction [7].

In the AGM model there is only one inconsistent belief set, namely the whole language. Belief bases fare much better in this respect; there are many different inconsistent belief bases that can represent different inconsistent states [120]. This feature of belief bases was employed in Hansson's and Wasserman's model of *local change* [144]. Given a belief base B and a sentence r, the r-compartment of B is the subset of B that is relevant for r. Revision of B by r involves changes only of the r-compartment; hence a part of the belief base can be made consistent while the belief base as a whole remains inconsistent. Wassermann has also investigated a construction with a short-term memory in which recently computed results are temporarily stored [263]. Local change can be used for diagnosis [265], i.e. the process of finding the faulty compartment of a malfunctioning system [218].

In a similar vein, Parikh [212] proposed a principle for relevance-sensitive change according to which, if the belief set can be split into two independent parts (expressed in different sublanguages), then revision of one part does not affect the other. Peppas provided a semantics for this principle in terms of systems of spheres [213]. Kourousias and Makinson have investigated conditions under which Parikh's relevence-sensitive condition is satisfied [164, 190].

Another approach to inconsistencies is to use a paraconsistent logic (i.e. a logic where  $\{p \land \neg p\} \vdash q$  does not hold in general) [215, 254].

#### 6.5 Multiple Change

In the original AGM model the input is a single sentence. In models of multiple change, the input is a set of sentences. Arguments have been given why no two of the four contractions  $K \div p \div q$ ,  $K \div q \div p$ ,  $K \div \{p, q\}$ , and  $K \div (p \lor q)$  should be expected to coincide in general [100]. However, it has been argued that the order-dependence of iterated operations is in itself problematic since ideally we should treat the pieces of information that we receive on an equal footing, independently of the order in which they arrive [61, 140].

Fuhrmann and Hansson identified two types of multiple contraction. In *package contraction* all members of an input set A are removed, hence  $(K \div A) \cap A = \emptyset$ . In *choice contraction* it is only required that at least one member of the input set be removed, i.e.  $A \nsubseteq K \div A$  [100]. Zhang has added a third option, *set contraction*. Its purpose is not to remove the input but to make the outcome compatible with the input. Hence, the outcome  $K \ominus A$  satisfies the property  $(K \ominus A) \cup A \nvDash \bot$ [273].

Most of the major AGM-related contraction operators have been generalized to multiple contraction: multiple partial meet contraction [100, 119, 173], multiple kernel contraction [89], multiple specified meet contraction [140], and a multiple version of Grove's sphere system [85, 217]. Spohn has proposed a ranking-theoretic account of multiple package contraction [252]. Fuhrmann has investigated the subtraction p - q that asserts p with the exception of what q says, and the merge operation  $p \circ q$  that extracts the maximized consistent content from p and q jointly [97, 98]. Finally, Zhang has investigated operations that are both iterated and multiple [274].

### 6.6 Indeterministic Change

The AGM model and most other models of belief change are deterministic in the sense that the outcome is always well-determined. There is no scope for chance in determining the outcome of the change. In indeterministic belief change, an operation can have more than one admissible outcome. Indeterministic belief change has been studied by Gallier [105] and by Lindström and Rabinowicz [177]. The latter authors gave up the assumption that epistemic entrenchment satisfies connectedness. This resulted in Grove's sphere systems with "fallbacks" that are not linearly ordered but still all include the original belief set.

### 6.7 Some Other Operators of Change

*Consolidation* An inconsistent belief base can be consolidated, i.e. made consistent by removing some of its elements. The consolidation of *B* is denoted *B*!. A plausible way to perform consolidation is to contract by falsum (contradiction), i.e.  $B! = B \div \bot [131]$ . In Olsson's *coherence consolidation*, enough of an incoherent belief base is removed to make it coherent [205].

*Replacement* replaces one sentence by another. Such an operator has two variables, such that in  $K|_q^p$ , p has been replaced by q. This operation can have outcomes that are not obtainable through either partial meet contraction or partial meet revision. Replacement can also be used as a kind of Sheffer stroke for belief change, since contraction, revision, and expansion can all be defined in terms of it.  $(K \div p = K \mid_T^p, K \ast p = K \mid_p^\perp)$ , and  $K + p = |_p^\top)$ . Partial meet replacement has been axiomatically characterized, and it also has a semantic account in terms of possible worlds [139].

*Reconsideration* introduced by Johnson and Shapiro [151, 152] is a nonprioritized operation on belief bases. It represents changes that are performed in hindsight in order to eliminate negative effects caused by previously performed changes, such as the reintroduction of previously removed beliefs. This operation can be produced by an algorithm that examines a subset of the retracted basic beliefs using dependency relationships.

*Multiagent Belief Change* AGM operations can be extended to cover changes performed jointly by more than one agent, who are assumed to combine

their beliefs in order to obtain a common, consistent set of beliefs. Konieczny and Perez have proposed an operator called merging that generalizes several previously proposed methods for conflict-solving combinations of information from two agents [162, 163]. For more than two agents, early work by Revesz [219] and Lin [174], based on distances between models, has been followed by several other approaches [19, 68, 182, 193, 194].

### 7 Applications and Connections

The AGM model has turned out to have a surprising number of connections with other areas of research.

### 7.1 Non-Monotonic and Defeasible Logic

In spite of the differences between belief revision and non-monotonic logic [111] it is possible to translate concepts, models, and results between these areas [192]. Non-monotonic reasoning can be expressed by an inference operator  $\succ$  such that  $A \vdash p$  denotes that A is a good enough reason to believe that p, or that p is a plausible consequence of A. However, contrary to Cn, C does not satisfy monotony (If  $A \subseteq B$  then Cn(A)  $\subseteq$  Cn(B)). Given a belief set K representing the background beliefs we can translate formulas between the two frameworks as follows:

$$p \vdash q$$
 if and only if  $q \in K * p$ 

Belief revision and non-monotonic logic have become increasingly interconnected. Satoh provided a model of belief change ("minimal revision") that satisfies the AGM postulates except Vacuity and Conjunctive overlap. It can be interpreted as a non-monotonic reasoning operator [240]. Lindström [175] and Rott [227] have shown that belief revision and non-monotonic logic are closely connected through their reconstructibility in terms of choice functions satisfying various rationality postulates. Other contributions in this tradition are [186, 224]. Billington et al. further clarified the relationships between AGM revision and non-monotonic inference [26].

In the last years of his life Alchourrón published a series of articles on the logic of defeasible conditionals [1–3]. He proposed that conditional constructions in ordinary language can often be understood as saying that an antecedent p together with a set of assumptions is a sufficient condition for the consequent q. Such conditionals can be represented by a formula  $\Box(f(p) \rightarrow q)$ , where f(p) is a function that takes us from p to the conjunction of p and its presuppositions. The connection between this approach and AGM was initially somewhat unclear [24], but in [87] axioms were given that relate it to a generalized version of AGM revision for an implicit underlying belief set K. This shows that there are close connections between Alchourrón's approach and Pagnucco's concept of abductive expansion which is also closely associated with non-monotonic inference [211].

#### 7.2 Description Logic

Description logics have been successful in detecting incoherences in databases, but provide little support for resolving these incoherences. Methodologies for belief change can be used to improve their performance in that respect. Techniques for ontology debugging are closely related to the identification of the kernel set in kernel (and safe) contraction. Using proposals by Benferhat et al. [25] and Meyer et al. [196] developed strategies for solving incoherences in a framework based on description logic. Ribeiro and Wassermann proposed a belief revision approach to finding and repairing inconsistencies in ontologies represented in description logics [220].

### 7.3 Horn Clause Contraction Functions

A Horn clause is a disjunction of one positive literal and at least one negated literal, such as  $p_1 \vee \neg p_2 \vee \neg p_3 \vee \neg p_4$ . With few exceptions [77, 221], studies of Horn clause belief change started only recently. Delgrande [60] investigated the contraction of theories expressed in propositional Horn logic and proposed two approaches that he called entailment-based and inconsistency-based [60]. For each of these he proposed a special kind of partial meet (and maxichoice) contraction. Delgrande and Wassermann [63] found that the application of contraction operators to remainder sets (as in AGM) has undesirable properties in Horn clause logic. Instead they developed an account of maxichoice Horn contraction that operates on weak remainder sets (defined semantically instead of syntactically).

Booth et al. provided a generalization of Delgrande's partial meet constructions and proposed that the latter are only a subset of the appropriate constructions of contraction in Horn logic [39] (cf. [100]). Booth et al. [40] also showed that their construction corresponds exactly to standard kernel contraction, as applied to Horn clauses. For further work on contraction in Horn logic, see [167, 276].

### 7.4 Game Theory

Belief change and game theory are related in several ways. Booth and Meyer [38] investigated equilibria in belief merging. The key idea is that a social belief removal function can be a minimal change in the AGM sense. Two classes of removal functions for agents have been studied: basic and hyperregular removal. The former has been axiomatically characterized by Booth [36]. Zhang studied bargaining from another viewpoint, proposing a logical axiomatization of bargaining solutions that is based on postulates from AGM and game theory [275].

The classical analysis of centipedes in the game theoretical literature (by Aumann, Binmore and others) shows that adequate models should be able to represent belief-contravening hypotheses and therefore also the notion of supposition. Samet [239] proposed that hypothetical knowledge can be represented by the operator:  $K_i^H(E) = \bigcup \{P \in \Pi_i: T_i(P, H) \subseteq E\}$ , where  $\Pi_i$ is a partition cell and  $T_i$  is a transformation function mapping partition cells and hypotheses to partition cells. This transformation function has the flavour of belief change but it is constrained by properties not used in the literature on belief change. Arló-Costa and Bicchieri proposed an operator of this sort that satisfies some of the AGM properties. They developed models in which the condition that all players are disposed to behave rationally at all nodes is both necessary and sufficient for them to choose the backward induction solution in centipede games. This result was obtained without assuming that rationality is commonly known (as in [20]) or commonly hypothesized by the players (as in [239]).

# 7.5 Argumentation

Falappa et al. [76] have argued that belief revision and argumentation theory are complementary approaches. By combining the two, the variety and complexity of reasoning processes is better accounted for than if only one of them is used. In [75], they combine ATMS (Assumption-based truth-maintenance systems) [58] with belief revision and propose a system that uses argumentative structures in the form of explanations for non-prioritized revisions of a belief base *B*. In this model, an epistemic input is composed of a sentence *p* and a set *A* of reasons to believe it. A partial acceptance revision operator is constructed such that *A* is initially accepted, which leads to the creation of  $B \cup A$  as a (possibly inconsistent) intermediate belief base from which inconsistencies are removed, giving rise to a consistent revised belief base  $B \circ A$ . The operator  $\circ$  is an operator of external revision in the sense explained in Section 4.1.

Paglieri and Castelfranchi proposed Data-oriented Belief Revision (DBR) as an alternative to AGM [50, 208]. This model combines belief revision with argumentation, following Toulmin's account of argumentation. The application of DBR to argumentation is primarily intended to highlight structural communalities between arguments and belief-supporting networks [209, 210]. The model contains two basic informational categories, data and beliefs. Contrary to beliefs, data are allowed to be contradictory. When a belief is abandoned, this does not entail removal of the corresponding data from the agent's memory, i.e. disbelieving is not forgetting.

# 7.6 Modal and Dynamic Logics

We can distinguish between three ways to integrate belief revision with a modal logic.<sup>1</sup> First, we can add epistemic or doxastic modal operators to make it explicit in the logical language that the belief set consists of *beliefs*. Secondly,

<sup>&</sup>lt;sup>1</sup>This section relies heavily on personal communications from Hans van Ditmarsch.

we can formalize the execution of expansion, revision, and contraction with dynamic modal operators, similar to those for program execution. Thirdly, we can add both epistemic and dynamic modal operators, to integrate belief and belief change in one language; this has been done in dynamic doxastic logic by Segerberg and collaborators and largely separately from that, later in dynamic epistemic logic.

A reason to investigate belief revision in modal logic is that the theories of belief change developed within the AGM tradition are not logics in a strict sense, but rather informal axiomatic theories of belief change. Instead of characterizing the models of belief and belief change in a formalized object language, the AGM approach uses a natural language (ordinary mathematical English) to characterize the mathematical structures under study. The approaches to be mentioned here "internalize" the operations of belief change into the object language.

*Explicit Belief Operators* An early approach was closely connected to nonprioritized belief revision. Let Bp denote that p is believed by the agent. Then  $\Box Bp$  can denote that p is necessarily believed, i.e., it is believed and no amount of epistemic input can change this.  $\Diamond \neg Bp$  means that it is possible to arrive at some state of belief in which p is not believed.  $\Diamond \Box B$  signifies that it is possible to arrive at some state in which p is believed and can after that no longer be disbelieved, etc. Depending on the details of the revision process, this can be shown to give rise to either an S4.2 or an S4 logic for the modal operator [129].

*Dynamic Modalities for Belief Revision* In various publications, van Benthem, de Rijke, and Fuhrmann [59, 95, 256, 257] introduced an "update logic" including the following notation:

 $\begin{array}{l} [\div p]q & (q \text{ holds after contraction by } p) \\ [\ast p]q & (q \text{ holds after revision by } p) \\ [+p]q & (q \text{ holds after expansion by } p) \end{array}$ 

This update logic can be seen as a precursor of subsequent treatments of belief change in dynamic logic.

Dynamic Doxastic Logic (DDL) extends propositional logical theories of formulas with both Hintikka-style doxastic operators [148] and dynamic modal operators for belief change [243–245]. It was defined by Krister Segerberg as a logical framework for reasoning about doxastic change. The basic DDL represents an agent that has opinions about the external world and an ability to change these opinions in the light of new information. Such an agent is non-introspective in the sense that it lacks opinions about its own belief states, for example B[\*p]q is not a well-formed formula. Lindström and Rabinowicz extended this model in order to include such formulas [181]. The extended model allows not only for introspective agents but also for iterated change, which has been studied by John Cantwell [47].

Dynamic Epistemic Logic (DEL) also studies changes in information and investigates actions with epistemic impact on agents [21, 214, 262]. Like DDL it has epistemic operators for belief or for knowledge and also dynamic operators for changes in belief or knowledge. The best-studied dynamics is that of the *public announcement* of a formula  $\phi$ . This can—with many reservations—be seen as a kind of belief expansion with  $\phi$ . One such reservation is that the postulate of success is not necessarily satisfied: after public announcement of  $\phi$  it need not be the case that  $B\phi$  is true, i.e., that  $\phi$  is believed. The standard counterexample is the Moore-sentence  $p \land \neg Bp$  [148, 197]. Clearly,  $B(p \land \neg Bp)$  is inconsistent for standard notions of knowledge and belief. In DEL, the Moore-sentence is just one example of an unsuccessful update, see [260].

Belief revision in the typical AGM sense is more problematic. If the agent believes in p (i.e., Bp is true), then a public announcement of  $\neg p$  will make her or his beliefs inconsistent. To model belief revision in DEL, we need Kripke models where knowledge, belief, and degrees of belief (or conditional belief) can all be encoded. To achieve this we can add *plausibility relations* to the Kripke models, and identify belief in  $\phi$  with truth of  $\phi$  in the most plausible of the epistemically accessible states.

For example, suppose that two states *s* and *t* are both considered possible by an agent, but (s)he considers *s* to be more plausible than *t*. Furthermore suppose that *p* holds in *s* but not in *t*. Then the agent believes that *p*. Belief revision with  $\neg p$  revises the plausibilities such that *t* becomes more plausible than *s*. Now, the agent believes that *p* is false:  $B\neg p$ . So we have  $Bp \land [*\neg p]B\neg p$ , where  $[*\neg p]$  is not a 'hard' (i.e., truthful) public announcement but a tentative or 'soft' (i.e., preference changing) public announcement. An alternative belief revision mechanism in the DEL setting is when the state *s* is eliminated from consideration (a 'hard' update, as for the execution of public announcements), after which the *t* is the most plausible (namely the only remaining) state. Again, the agent believes that *p* is false. These issues were addressed by Aucher [17], van Benthem [258], van Ditmarsch and Labuschagne [259, 261], and Baltag and Smets [22] (with many follow-up papers). Conditional reasoning and reasoning with different degrees of belief can also be modelled in such settings.

#### 7.7 Belief Change by Translation Between Logics

The AGM paradigm can be extended to non-classical logics by translating the source logic into classical logic, performing the change and then translating back. This method was proposed independently by two groups. Gabbay et al. [102, 103] respectively Coniglio and Carnielli [54]. The latter defined logics as two-sorted first-order structures, and argued that this broad definition encompasses a wide class of logics with theoretical interest as well as interest from the point of view of applications. The language, concepts and methods of model theory can be used to describe the relationships between logics through morphisms of structures called transfers. They define a model of belief change,

called Wide Belief Revision Systems, to define belief revision for non-standard logics.

### 7.8 Truth

In eliminative induction a number of possible hypotheses concerning some state of affairs are presumed, and rivals are progressively eliminated by new evidence. The process is an idealization, since in practice no closed set of initial theories is usually available. Kelly found similarities between the process of eliminative induction and theory change, and proposed the use of belief revision to arrive at informative, true, empirical belief on the basis of increasing information. He analyzed several algorithms of iterated revision (see Section 5), assuming that learning is based on the outcomes of sequential experiments [157].

7.9 Use of Choice Functions and Related Preference Orderings

The classical theory of rational choice was developed by mathematical economists [15, 16, 247]. It occupies a central role in the philosophy of the social sciences.

Choice rationality is concerned with how to choose rationally among a set of alternatives. Formal requirements are imposed on choices from different, overlapping alternative sets. The standard presumption is that selection functions are rationalizable in terms of some underlying binary preference relation. Formally, this is represented in structures containing a set of alternatives  $\Omega$ and a function f that takes us from any subset E of  $\Omega$  to a subset of E. The main objective of rational choice theory is to investigate the conditions under which the function f can be rationalized by a total pre-order R on  $\Omega$  in the sense that, for every  $E \subseteq \Omega$ , f(E) coincides with the best elements of Eaccording to R. However, as discussed by Sen [248], social norms and menu dependence can make rationalizability in terms of an underlying preference relation impossible.

The structures studied in rational choice theory have a close connection with the selection functions employed in belief revision. In his book [231], Rott relates belief revision, non-monotonic reasoning and rational choice, and shows how standard postulates of belief change and non-monotonic reasoning correspond to the constraints of classical theories of rational choice. According to Rott, these connections constitute an important bridge between practical and theoretical rationality.

Olsson [206] conceded that Rott's work is indisputable as a formal achievement, but puts his philosophical conclusions in question. According to Olsson, Rott has not discovered any surprising connections between revision and choice. Instead he has reconnected the AGM theory with its roots in counterfactual reasoning and rational choice.

Further studies in this area have been reported by Arló-Costa and Pedersen [14] and by Bonanno [33].

#### 8 Computability and Implementation

Belief revision has usually been studied from the viewpoint of ideal agents (resource bounded or not). The performance of belief change operations in a computer or robot gives rise to new challenges. From a practical point of view we have to deal with actual limitations in memory, reasoning, accuracy, etc. From a theoretical point of view the computational tractability of the proposed algorithms is a major challenge.

In the 1980's several algorithms for the implementation of belief change operations were proposed. Most of them were constructed to recognize which beliefs are supported and how, and to perform changes while minimizing the number of (usually atomic) sentences to be changed. Major examples are the algorithms proposed by Doyle, [65], Borgida [43], Winslett [272], Dalal [56] and Satoh [240]. Katsuno and Mendelzon [155] provided an overview of several of these approaches.

Two logics suitable for supporting belief revision systems have been proposed. The first of these was due to Martins and Shapiro (in an early paper that also described an actual implementation) [195], and the second to Gabbay et al. [104]. Recent works on implementation also include proposals by Williams [270], Williams and Sims [271], and Delgrande and Schaub [62].

A core aspect in implementation is the space and time required for computation. One of the first studies of the cost of belief change algorithms was performed by Eiter and Gottlob [71]. In a survey written in 1998 Nebel said:

"The general revision problem for propositional logic appears to be hopelessly infeasible from a computational point of view because they are located on the second level of the polynomial hierarchy" [203].

However, specific algorithms can reduce this computational cost. The determination of what properties have to be resigned in order to gain efficiency is a major challenge for future studies. An interesting step was taken by Jin and Thielscher who proposed a model called Reinforcement Belief Revision that combines two important desiderata for belief change implementations: It satisfies the standard rationality postulates, and the time and space required for its implementation can be assessed [150].

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