

On the revision of informant credibility orders



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ABSTRACT

In this paper we propose an approach to multi-source belief revision where the *trust* or *credibility* assigned to informant agents can be revised. In our proposal, the credibility of each informant represented as a strict partial order among informant agents, will be maintained in a repository called *credibility base*. Upon arrival of new information concerning the credibility of its peers, an agent will be capable of revising this strict partial order, changing the trust assigned to its peers accordingly. Our goal is to formalize a set of change operators over the credibility base: expansion, contraction, prioritized, and non-prioritized revision. These operators will provide the capability of dynamically modifying the credibility of informants considering the reliability of the information. This dynamics will reflect a new perception of trust assigned to the informant, or extend the set of informants by admitting the addition of new informant agents.

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1. Introduction

In this paper we will consider a set of deliberative agents that participate in a multi-agent system; each agent may play the role of an informant for other agents in the system. In this scenario, each agent could receive information from multiple sources, and the agents' subjective attribution of trust or credibility to a particular informant can be related to the trust attributed to others. Thus, when different agents provide conflicting information, or an agent gives information in conflict with the information the agent maintains, the credibility of the informants can be used to obtain a prevailing conclusion that will allow the agent to update its stored information.

In Multi-Source Belief Revision (MSBR) [10,15,49], a single agent can obtain new beliefs from multiple sources of information. Some proposals found in the literature of MSBR assume an order among sources (or informants), and use this order to decide which information prevails when a contradiction arises.

In this paper we propose an approach to MSBR where the *credibility* assigned to informant agents can be revised. To attach some degree of *informational* or *epistemic trust* to data received as information from an external source [45], is a common social device for human agents. We are drawing a distinction between epistemic trust and practical trust, making a suggestive analogy with epistemic and practical reasoning; the former being reasoning about what to believe and the latter being reasoning about how to act. Epistemic trust is therefore about the degree of acceptance an agent is willing to attach to a piece of information coming from another agent. Following the analogy, practical trust can be considered as trust in that an agent will act as she has promised to act. Notice that in this case, this is a form of subjective trust or

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credibility, *i.e.*, trust as perceived and stored by an agent. Here, we will assume that the information received from an agent is as credible as the agent that provides it; this is a simplifying assumption that will be lifted in future investigations. We will also limit the present research to single topic credibility.

Furthermore, we can distinguish two types of MSBR. *Unitary MSBR* where an agent can receive from different informant agents an atomic piece of information (a sentence or a belief); and *Conjunctive MSBR* where the received information is a set of objects, probably provided by one or more sources. Our paper is focused on the first approach. Other works are focused on the second approach where the new information is a set of beliefs. For a more detailed comparison, *cf.* Section 8.

We will favor the use of the word credibility to refer to this characteristic of informant agents as this particular word carries an intuitive sense that helps to understand the related problems. We chose to represent credibility as a strict partial order in the set of agents; this choice will give us the capability of representing cases where the credibility of two agents is not related because it has not been established. The examples introduced below will show the usefulness of having this possibility.

The credibility relation of an agent and its informants will be maintained as a *credibility base* that will keep the current state of this particular strict partial order relation. As new assessments regarding the credibility of its informants are effected, an agent will be able to change this partial order relation, and in that manner, revise the credibility assigned to its peers accordingly.

Our goal is therefore to formalize change operators over the credibility base. These operators will provide the capability of dynamically modifying the credibility of informants to reflect a new perception of the informant's trust, or extend the set of informants by admitting the arrival of new informant agents. We will develop an expansion operator for a credibility base, then a contraction operator and finally two versions of revision: prioritized and non-prioritized. Contraction and revision operators will be based on the *reliability* of the information. Thus, the main contribution is the definition of different belief change operators that use the reliability of the information in order to make decisions regarding what information prevails. Following the approach presented in the AGM model [1], these operators are defined through constructions and representation theorems.

We will adopt an epistemic model where beliefs are provided by some informant(s). If the agent considers that *Informant₁* is less credible than *Informant₂* then, in case of conflictive information, the information received from *Informant₂* will be preferred over the information received from *Informant₁*. That is, the *trust* assigned to *Informant₂* is higher than the trust assigned to *Informant₁*; hence, in our proposal, the *reliability* of a piece of information will reflect the credibility assigned to the informant.

A common approach to the analysis of the reliability of information is obtained by integrating different sources that rely on the use of some form of a majority principle (see Section 8). In some of those approaches, and oversimplifying the description of the decision mechanism they introduce, when two or more sources provide the same piece of information α , and a single agent gives $\neg\alpha$, then α will be preferred. It is clear that using majority in the process of deciding is a very useful and computationally efficient approach for many situations, but it might not be appropriated in some complex scenarios that require a qualitative analysis of the information; in domains where there exists an order among informants, it is natural to prefer the information of the more credible one. As an example, consider the situation where an agent seeks information on a particular topic in an internet children's health forum. Reading the forum the agent finds out that four participants provide information α on the subject; but later the agent's pediatrician provides $\neg\alpha$. If the agent assigns a higher credibility to the pediatrician than the perceived credibility of the other four; then, clearly in this case $\neg\alpha$ should prevail. Thus, our approach can be considered as complementary to those that use majority for taking decisions. This complementarity is important since majorities not always are right; the previous example and our motivating example below is intended to show precisely that.

Lately, the importance of having trust models have been emphasized in the literature. As stated in [44], two elements have contributed to substantially increase the interest on trust: the introduction of the multi-agent system paradigm and the evolution of e-commerce. The study of trust has many applications in Information and Communication technologies.

It is clear that some form of trust model is needed in any problem where the adoption of a critical decision depends on the credibility (informational trust) assigned to the information received from other agents. A crucial activity in multi-agent system is the agent's interaction, and through this interaction agents can share different types of information. Significantly, they can share information about the credibility or informational trust they have assigned to their peers; hence, through this interaction, the credibility assigned to their peers could change. In this work we will propose change operators for handling the dynamics in the credibility information.

In Sabater and Sierra [44], a set of relevant aspects to classify trust models is proposed. In our proposal, we will take into consideration only two of these aspects: *information sources* and *trust reliability measure*. They suggest that, sometimes knowing how reliable is the trust value reported, and its relevance to the decision making process, is as important as the value itself. In the model that we will propose, we provide this kind of information through agent identifiers which are the information sources.

Although there exist relevant works in Multi-Agent Belief Revision [35,30,15,10] and in Trust and Reputation [44,43,14,4,45], their combination in one formalism and its formalization through representation theorems is novel. Our approach can be applied in any system requiring that trust or credibility of informants will be taken into consideration. For instance, the partial order of informants and the belief change operators we will introduce can be used as a complement for the model of MSBR proposed in [49] where informant agents are used, but a fixed total order was assumed among them. Thus,

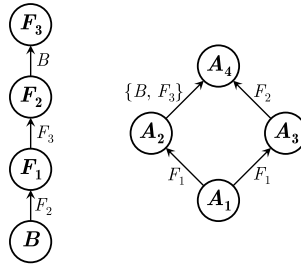


Fig. 1. Directed graph depicting the credibility base of agent B .

our proposal improves that model providing not only a less restrictive organization but also a more realistic scenario by incorporating a strict partial order of informants that can be revised dynamically. We will compare the previous approach with the new in the related work section, where we will also compare it with other proposals.

Some preliminary work related to this paper was reported in [47], where change operators for a partial order were proposed; however, we will extend that work in several ways. As we will explain below, in contrast to [47], the approach we present here will formalize how the agents receive and store information in a credibility base, and also how the reliability of the information is represented. We will specify which information prevails in the revision process, *i.e.*, we will propose a reliability-based criterion to select which information is eliminated upon revision. Based on the reliability of the incoming information a non-prioritized revision operator is also proposed here.

Ma et al. [37] in a recent paper introduce a prioritized revision of partial pre-orders. However, in that work reliability values are not considered in the revision process (see Section 8).

Before concluding this introduction, we would like to discuss an example. This example will serve two purposes: to motivate the main ideas of our proposal, and as a running example to be used in the rest of the paper.

1.1. Motivating example

Consider an agent B that wants to buy a car; this agent can get information from other agents that are not equally credible to him. Agent B can obtain information from three fellow coworkers (F_1 , F_2 , and F_3) that B considers to have experience in buying cars. Also, B can consult four advisors (A_1 , A_2 , A_3 and A_4) who are specialists in the area. In our approach, the credibility assigned by B to these informants can be revised. As we will describe next, the credibility of each informant agent with respect to the other agents will be represented as a strict partial order, also keeping track of the source where the information comes from. Thus, when B receives new information about credibilities, he is able to revise his partial order, and the source of the information can be used for deciding which information prevails.

As we will explain in Section 3, the formalism provides a *credibility base* where the credibility that an agent B assigns to his informants is maintained; the credibility base can be depicted as a directed graph (see Fig. 1). Nodes in this graph represent agents and directed arcs represent the credibility order between agents. An arc from node N_1 to N_2 labeled with the set of agents $\{L_1, \dots, L_n\}$ represents the fact that N_1 is strictly less credible than N_2 and that the information was provided by the agents L_1, \dots, L_n ; when the information comes from just one agent L we will not use set notation. Thus, in our approach the label will represent the *reliability* of “ N_1 is strictly less credible than N_2 ”.

Fig. 1 depicts the credibility base of agent B that wants to buy a car. In this particular example, B considers that F_2 is less credible than F_3 . He also has some information from F_3 that states that F_1 is less credible than F_2 and from F_2 that states that he (B) is less credible than F_1 . Agent B and agent F_3 both consider that A_2 is less credible than A_4 . Therefore, in this case, the label of the arc is represented as the set $\{B, F_3\}$. Furthermore, fellow F_1 has told agent B that A_1 is less credible than A_2 and that A_1 is less credible than A_3 . His other fellow F_2 has told him that A_3 is less credible than A_4 . Note that the credibility relation is transitive, and therefore, in this particular example, for agent B his informant A_1 is currently less credible than A_4 . The information maintained in a credibility base is not static and can be changed upon the arrival of new information. Consider for instance that agent B obtains new information from F_1 that A_2 is less credible than F_2 . This should be represented with an arc labeled F_1 from node A_2 to node F_2 . Note that this new information does not contradict the information represented in the graph of Fig. 1, and hence can be added without further consideration.

Consider now F_3 tells B that in his opinion, A_4 is less credible than A_1 . This should be represented with an arc labeled F_3 from node A_4 to node A_1 . Clearly, this new information contradicts the information represented in the graph of Fig. 1, because there are two paths in the graph stating that A_1 is currently less credible than A_4 : the path $[A_1, A_3, A_4]$ supported by the informants F_1 and F_2 , and the path $[A_1, A_2, A_4]$ supported by F_1 , F_3 and B himself. Therefore, if B wants to consider this new information (*i.e.*, A_4 is less credible than A_1), he must revise the credibilities assigned to his informants. Note that the new information is supported by F_3 , and B considers that F_3 is more credible than F_1 , F_2 , and himself. In our approach, the credibility assigned to the informant agents will be used in two ways: to decide if the revision is done, and also to decide which information is withdrawn. In other words, the information represented in the agents’ credibility partial order will be used to revise the credibility partial order itself.

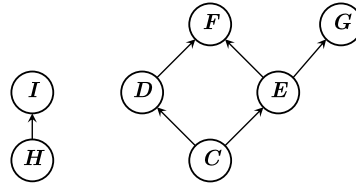


Fig. 2. A graph representation of credibility order \mathcal{O}_1 .

The rest of this paper is structured as follows. Section 2 shows some preliminary concepts. In Section 3 a new representation for informant credibility is proposed. Sections 4, 5 and 6 define respectively: expansion, contraction, and prioritized revision for our trust model. Section 7 presents a non-prioritized revision based on a reliability criterion. In Section 8 related work is analyzed. Finally, in Section 9 conclusions are offered and ideas for future work are given. All the proofs for the representation theorems can be found in Appendix A.

2. Preliminaries

An analysis of Belief Revision in Multi-Agent Systems was introduced in Liu and Williams [35,36]. There, a hierarchy that divides Belief Revision in two big areas is proposed: (1) *Individual Belief Revision* (IBR), and (2) *Multi-Agent Belief Revision* (MABR), also sometimes referred to as *Intelligent Distributed Belief Revision*. In [30,35,36,40] different formalizations of MABR have been presented. MABR investigates the *overall* belief revision behavior of an agent team, or of a society, that in order to accomplish a shared goal its members need to communicate, cooperate, coordinate, and negotiate with each other. In the hierarchy introduced, the first area of Individual Belief Revision, is also divided in two: (1.a) *Belief Revision in a single agent environment* (called SBR) and (1.b) *Individual Belief Revision in a multi-agent environment*, also called *Multi-Source Belief Revision* (MSBR). In MSBR, an individual belief revision process is carried out where the new information may come from multiple sources. MSBR studies individual agent revision behaviors, *i.e.*, when an agent receives information from multiple agents towards whom he has social opinions [36]. Therefore, the approach presented in this paper corresponds to MSBR. In contrast, MABR investigates the overall BR behavior of agent teams or societies.

In our formalization, an agent can obtain new beliefs from multiple sources (informants) that are not equally credible, and their credibility can change dynamically. We will consider a universal finite set of informants $\mathbb{A} = \{A_1, \dots, A_n\}$ and a strict partial order defined among these informants. In previous work [47,46], the basic structure introduced below was proposed; we will recall it here, and in the next section we will extend it by adding the capability of maintaining the source from which each piece of information comes.

Definition 1 (*Credibility order – credibility tuple*). Given a finite set of informants \mathbb{A} , a *credibility order* over \mathbb{A} is a binary relation on \mathbb{A} called \mathcal{O} ($\mathcal{O} \subseteq \mathbb{A} \times \mathbb{A}$). An informant $A_1 \in \mathbb{A}$ is less credible than an informant $A_2 \in \mathbb{A}$ according to \mathcal{O} if $(A_1, A_2) \in \mathcal{O}^*$, where \mathcal{O}^* represents the transitive closure of \mathcal{O} . The pair (A_1, A_2) is called a *credibility tuple*.

Graphically, a credibility order \mathcal{O} is represented as a directed graph, where the informants in \mathbb{A} label the nodes, and for each tuple $(A_1, A_2) \in \mathcal{O}$ there is an arc from node A_1 to node A_2 . For example, given the set of informants $\{C, D, E, F, G, H, I\}$, Fig. 2 shows the graph representation of the credibility order $\mathcal{O}_1 = \{(C, D), (C, E), (D, F), (E, F), (E, G), (H, I)\}$.

Consider for instance, $\{(C, D), (D, C)\} \subseteq \mathcal{O}^*$, this would lead to the belief that both C is less credible than D and that D is less credible than C . Since these beliefs are contradictory, to accept them simultaneously would result in an inconsistent belief status. For this reason we require of the credibility order to be a strict partial order, *i.e.*, the relation must be irreflexive, antisymmetric and transitive. We address this matter in the following definition.

Definition 2 (*Sound credibility order*). A credibility order $\mathcal{O} \subseteq \mathbb{A} \times \mathbb{A}$ is said to be *sound* iff \mathcal{O}^* is a strict partial order over \mathbb{A} .

Example 1. The credibility order \mathcal{O}_1 showed in Fig. 2 is sound. However, $\mathcal{O}_2 = \mathcal{O}_1 \cup \{(F, C)\}$ is *not* sound because (C, F) and (F, C) are in \mathcal{O}_2^* , violating the antisymmetry condition.

In [47], change operators (expansion, contraction and revision) for \mathcal{O} were proposed. Nevertheless, in that work there are some important points that have not been addressed: (a) that model does not formalize how the agents receive and store credibility tuples in order to consider the informant agent; (b) it is not specified which information prevails in the revision process (*i.e.*, it is not specified how to select which information is eliminated upon revision); and (c) the new information always has priority, a situation that can be unrealistic in some scenarios (see [17,16]). To clarify the last point, consider for instance information coming from different sources, and that a preference among sources can be established, then a non-prioritized method can be more adequate since the information already known might have higher preference.

We will address in turn the items mentioned above and advance a proposal for each one. In the next section we will formally define the notion of *credibility base*; this type of base stores credibility tuples together with their associated information source representing the reliability of each piece of information. With this device, we can overcome the drawbacks mentioned above; that is, credibility will be used to decide which information prevails in the revision process. We will also introduce a non-prioritized revision operator that uses a reliability-based criterion to decide whether the new information is accepted or rejected.

3. Representing the credibility of informants

In the scenario described, an agent can receive credibility tuples from other agents in the form of *credibility objects*. For instance, consider the example proposed in our introduction: agent B (that wants to buy a car and has several informant agents) receives from a fellow coworker F_3 the information that the advisor A_4 is less credible than A_1 . In this case, B will receive the credibility object $[(A_4, A_1), F_3]$ representing that the credibility tuple (A_4, A_1) was provided by F_3 .

Definition 3 (*Credibility object*). Let \mathbb{A} be a set of agent identifiers and $B, D, S \in \mathbb{A}$, where $S \neq B$ and $S \neq D$. A *credibility object* is a pair $[T, S]$ which represents that S is the information source of T , where $T = (B, D)$ is a credibility tuple.

Observe that the definition establishes that in a credibility object $[T, S]$ the source S cannot be in any place in T . A discussion considering the reasons for having this restriction is included in Section 9. Credibility objects will be stored in the agent's credibility base.

Definition 4 (*Credibility base*). Let \mathbb{A} be a set of agent identifiers. A *credibility base* of an agent $A \in \mathbb{A}$ is a finite set \mathcal{C}^A of credibility objects.

Example 2. Consider again the scenario described in the introduction. The credibility base of the agent B is $\mathcal{C}^B = \{[(B, F_1), F_2], [(F_1, F_2), F_3], [(F_2, F_3), B], [(A_1, A_2), F_1], [(A_1, A_3), F_1], [(A_2, A_4), B], [(A_2, A_4), F_3], [(A_3, A_4), F_2]\}$. Then, for instance, from \mathcal{C}^B the informant A_1 is less credible than A_3 , A_1 is less credible than A_4 , and A_2 and A_3 are incomparable. Observe that the credibility objects $[(A_2, A_4), B]$ and $[(A_2, A_4), F_3]$ both refer to the same credibility tuple but with a different informant. That is, the information that A_2 is less credible than A_4 was informed by F_3 and also known by B . Below it will be clear that this feature will be an advantage in our representation.

Note that the credibility base \mathcal{C}^B of an agent B can contain credibility tuples received from other informant agents (e.g., $[(F_1, F_2), F_3]$) and credibility tuples of the agent B himself as well (e.g., $[(F_2, F_3), B]$). Also, note that the owner of the credibility base can be included in credibility tuples of its own credibility base (e.g., $[(B, F_1), F_2]$).

Credibility bases will be depicted as directed graphs with labeled arcs. If a credibility object $[(F_1, F_2), F_3]$ is in the credibility base, then in the associated graph, there will be an arc labeled with F_3 from node F_1 to node F_2 . If there is more than one credibility object with the same credibility tuple then, instead of adding several arcs from one node to another, the arc will be labeled with the related set of informants. See for instance Fig. 1 where the graph representation for \mathcal{C}^B of Example 2 is shown.

The set $\mathbb{C} = 2^{(\mathbb{A} \times \mathbb{A}) \times \mathbb{A}}$ will represent all the possible credibility bases that can be built involving elements of \mathbb{A} ; notice that we are using square brackets surrounding the credibility objects to make the notation clearer.

Given a credibility base \mathcal{C} , the function Cl defined below, characterizes the agent's strict partial order as the transitive closure of the set of credibility tuples that are contained in the credibility objects of \mathcal{C} .

Definition 5 (*Closure function*). Let $\mathcal{C} \in \mathbb{C}$ be a credibility base and $\mathcal{O} = \{(B, C) : \text{there is } A \in \mathbb{A} \text{ and } [(B, C), A] \in \mathcal{C}\}$. The *closure function* is a function $Cl : \mathbb{C} \rightarrow 2^{\mathbb{A} \times \mathbb{A}}$, such that $Cl(\mathcal{C}) = \mathcal{O}^*$.

Definition 6 (*Sound credibility base*). A credibility base $\mathcal{C} \in \mathbb{C}$ is sound if $Cl(\mathcal{C})$ is sound.

Therefore, given a sound credibility base \mathcal{C} , $Cl(\mathcal{C})$ represents the credibility strict partial order that the agent will use to compare informants. For instance, from the credibility base \mathcal{C}^B of Example 2 we obtain that $(A_1, A_4) \in Cl(\mathcal{C}^B)$, i.e., for agent B , A_1 is less credible than A_4 . Note also that $\{(B, F_2), (B, F_3)\} \subseteq Cl(\mathcal{C}^B)$.

Remark 1. Given an agent $A \in \mathbb{A}$, we assume its credibility base \mathcal{C}^A is sound.

Consider the agents $A, B, C, I \in \mathbb{A}$. As it will be explained in detail below, when an agent A receives a credibility object $[(B, C), I]$ which does not generate cycles in his current credibility base (i.e., $(C, B) \notin Cl(\mathcal{C}^A)$), then $[(B, C), I]$ can be added to \mathcal{C}^A and the resulting credibility base will be sound. Note that it may be the case that $(B, C) \in Cl(\mathcal{C}^A)$; nevertheless, $[(B, C), I]$ will be also added to \mathcal{C}^A because the credibility of the informant agent I can increase the reliability of (B, C) .

This design decision implies that in the representation a credibility tuple can appear more than once in a credibility base; but from the point of view of the credibility objects stored in the credibility base there is no redundancy because each credibility object contains a different informant.

If the received credibility object generates a cycle, then a revision of the credibility base must be effected. With this problem in mind, in the following sections we will define a change theory for credibility bases giving the agents the capability of changing the strict partial order relation that represents the trust on their peers.

Let us consider a pair of informants A and B , and a credibility base C such that $(A, B) \in Cl(C)$, and recall our assumption that each agent has a sound credibility base (see Remark 1). The main task of a contraction operator is to obtain a new credibility base C' in which $(A, B) \notin Cl(C')$, losing as little information as possible. As we will show below, contraction does not mean simply removing from C those credibility objects containing the credibility tuple (A, B) . Like in [47], it is necessary to consider every *path* from A to B , where the usual notion of simple path in an acyclic directed graph is used. We introduce the necessary definitions below.

Definition 7 (Simple path). Let $A, B \in \mathbb{A}$ and $C \in \mathbb{C}$. A simple path P from A to B in C is a subset P of C such that $(A, B) \in Cl(P)$ and there is no proper subset P' of P such that $(A, B) \in Cl(P')$.

When no confusion is possible, we will refer to simple paths just as paths.

Definition 8 (Paths set). Given a pair of informants $A, B \in \mathbb{A}$ and a credibility base $C \in \mathbb{C}$, we define the *paths set* from A to B in C , denoted $\mathcal{C}_{(A-B)}$, as $\mathcal{C}_{(A-B)} = \{P: P \text{ is a path from } A \text{ to } B \text{ in } C\}$.

Example 3. Consider the credibility base of agent B shown in Example 2 and depicted in Fig. 1, $C^B = \{(B, F_1), F_2\}, \{(F_1, F_2), F_3\}, \{(F_2, F_3), B\}, \{(A_1, A_2), F_1\}, \{(A_1, A_3), F_1\}, \{(A_2, A_4), B\}, \{(A_2, A_4), F_3\}, \{(A_3, A_4), F_2\}\}$. Then, the paths set from A_1 to A_4 in C^B is $\mathcal{C}_{(A_1-A_4)}^B = \{P_1, P_2, P_3\}$, where:

$$P_1 = \{[(A_1, A_2), F_1], [(A_2, A_4), F_3]\}$$

$$P_2 = \{[(A_1, A_2), F_1], [(A_2, A_4), B]\}$$

$$P_3 = \{[(A_1, A_3), F_1], [(A_3, A_4), F_2]\}$$

Remark 2. Given $C \in \mathbb{C}$, since $Cl(C)$ is defined over the transitive closure of the credibility order among informants (see Definition 5), then it holds that $(B, D) \in Cl(C)$ if and only if there exists at least one element in $\mathcal{C}_{(B-D)}$.

In the following sections we will develop the expansion operator, then the contraction operator, and finally two versions of revision: prioritized and non-prioritized.

4. Expansion operator using reliability

In this section we will introduce an operator which expands a sound credibility base by a credibility object. This operator, unlike classic expansion operators, will be conditioned in its behavior by maintaining the soundness of the credibility base that is obtained. As we noted in Remark 1, we are restricting our scope to sound credibility bases. At this point, it is also worthwhile to observe that this operator is a true expansion since the resulting credibility base always includes the original elements of the expanded base. That is, even in the case where it is not possible to add the credibility object because the resulting credibility base would not be sound, the operator maintains the original one.

4.1. Postulates for the expansion operator

We will use “+” to denote a general expansion operator, and we will propose a set of postulates that will characterize a class of expansion operators whose behavior is such that they will preserve the property of soundness of the credibility base. In what follows, we will assume that $C \in \mathbb{C}$ is a sound credibility base, $A, B, D \in \mathbb{A}$ are three agents, and $T \in \mathbb{A} \times \mathbb{A}$ is a credibility tuple.

E1 – Relative success: $C + [T, A] = C$ or $[T, A] \in C + [T, A]$.

This postulate is characterizing the behavior of the operator as a particular expansion where the attempt to augment the credibility base might fail or be successful. It is interesting to observe that in the case of failing in the expansion the credibility base is not altered.

E2 – Weak success: if $(B, A) \notin Cl(C)$ then $[(A, B), D] \in C + [(A, B), D]$.

This postulate establishes that $[(A, B), D]$ is accepted in the expanded credibility base if there is no pair (B, A) in $Cl(C)$.

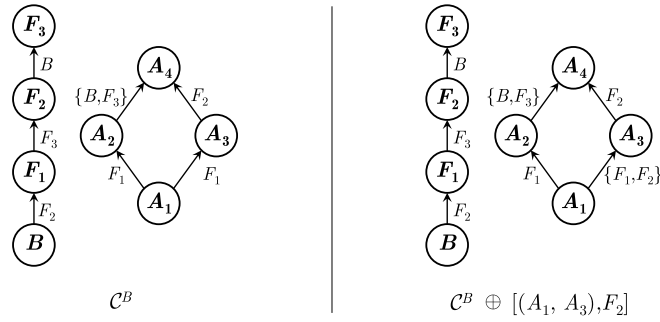


Fig. 3. Expansion using reliability.

E3 – Inclusion: $C \subseteq C + [T, A]$.

This postulate reflects the fact that the agent will not loose information during the expansion.

E4 – Vacuity: if $[T, A] \in C$ then $C + [T, A] = C$.

A particular case of expansion occurs when a credibility base C is expanded by a credibility object $[T, A]$ which is already in C . In this case, expanding C by $[T, A]$ does not generate any change in C . The name vacuity follows the tradition of belief revision literature, showing a case in which the expansion operator does not change anything.

E5 – Soundness: if C is a sound credibility base then $C + [T, A]$ is a sound credibility base.

An operator satisfying this postulate will guarantee the preservation of soundness over the resulting expanded credibility base.

E6 – Minimality: $C + [T, A]$ is the smallest set satisfying E1 to E5.

Similarly to expansion in AGM [23, p. 51], we require that $C + [T, A]$ does not contain more credibility objects than the ones required by other postulates.

4.2. Construction

We will give now the realization of a credibility based expansion operator for credibility bases called *C-expansion using reliability* (or C_R -expansion for short) that is denoted “ \oplus ”. A C_R -expansion operator will add a new credibility object to a credibility base when soundness is preserved or will leave the credibility base unaffected rejecting the addition in case soundness is violated by it.

Definition 9 (C_R -expansion). Let $C \in \mathbb{C}$ be a sound credibility base, and $[(A, B), S]$ a credibility object. The operator “ \oplus ”, or C_R -expansion, is defined as follows:

$$C \oplus [(A, B), S] = \begin{cases} C \cup \{[(A, B), S]\} & \text{if } (B, A) \notin Cl(C) \\ C & \text{otherwise} \end{cases}$$

Proposition 1. An expansion operator \oplus satisfies E1 to E6 if and only if \oplus is defined according to Definition 9.

Proof. Straightforward. \square

The following example shows a particular feature of our expansion operator.

Example 4. Consider again the credibility base C^B of Example 2. Then, $C^B \oplus [(A_1, A_3), F_2] = C^B \cup \{[(A_1, A_3), F_2]\}$ increases the reliability of (A_1, A_3) since F_2 is more credible than F_1 . Fig. 3 shows (left) the graph for the original credibility base C^B and (right) the graph for the resulting credibility base after the expansion by $[(A_1, A_3), F_2]$.

The reason for preserving all the credibility objects containing the same tuple as opposed to just keeping the one with the most credible informant is motivated in the fact that upon revision it is possible that the credibility order among informants might change, and in that case always the tuple will be informed by the informant that is currently the most credible.

5. Contraction operator using reliability

In this section, following [2] and [25], we will define an operator which contracts a credibility base by a credibility tuple. We will introduce the postulates of this operator first, then the construction, and finally the representation theorem.

Remark 3. Credibility bases contain credibility objects (i.e., credibility tuples associated to informants); still, when an agent contracts its credibility base the contraction will be done by a credibility tuple, and not by a credibility object. The reason for not including the informant of the credibility tuple is twofold. Firstly, note that some of the credibility tuples that the agent might want to exclude are not provided by another agent but they are introduced in the strict partial order by the transitive closure; thus, these credibility tuples do not have a credibility object associated. Secondly, even in the case the credibility tuple has at least one informant associated, i.e., there is at least a credibility object in the credibility base carrying that tuple, the contraction must erase *all* the credibility objects that contain it.

We will adapt the notion of *safe element* proposed in [2] for contraction. In that article, an order among sentences is considered, and the contraction operator is defined over belief sets, whereas in our approach the contraction operator is defined over credibility bases. Let (D, E) be a credibility tuple that we would like to eliminate from \mathcal{C} . We say that a credibility object $[(F, G), H]$ of \mathcal{C} is *safe* with respect to contraction by (D, E) in \mathcal{C} if and only if every path from D to E either does not contain $[(F, G), H]$, or the path contains some credibility object $[(I, J), K]$ with $(K, H) \in Cl(\mathcal{C})$. That is to say, $[(F, G), H]$ is safe with respect to contraction by (D, E) in \mathcal{C} if and only if there is no path from D to E that contains $[(F, G), H]$, or for every path P from D to E that contains $[(F, G), H]$ then P does contain some credibility object whose source is less credible than H according to \mathcal{C} . In the rest of the paper, and only when no confusion arises, we will sometimes write “*is safe*” instead of “*is safe with respect to contraction by (D, E) in \mathcal{C}* ”.

Example 5. Let $\mathcal{C} = \{(D, F), J\}, [(D, H), L], [(F, G), M], [(H, G), M], [(G, E), K], [(J, K), E], [(K, L), G], [(L, M), E]\}$. Then, the credibility objects $[(D, H), L], [(F, G), M], [(H, G), M], [(J, K), E], [(K, L), G], [(L, M), E]$ are safe with respect to contraction by (D, E) in \mathcal{C} ; whereas the credibility objects $[(D, F), J]$ and $[(G, E), K]$ are not safe with respect to contraction by (D, E) in \mathcal{C} .

5.1. Postulates for the contraction operator

Let $D, E, F, G \in \mathbb{A}$, let $\mathcal{C}, \mathcal{C}' \in \mathcal{C}$ be two sound credibility bases, and let $T_1, T_2 \in \mathbb{A} \times \mathbb{A}$ be two credibility tuples. We will use “ $-$ ” to denote a general contractor operator, and we will propose the following postulates for contraction.

C1 – Success: $(D, E) \notin Cl(\mathcal{C} - (D, E))$.

A tuple cannot be entailed by the credibility base resulting from its contraction.

C2 – Inclusion: $\mathcal{C} - (D, E) \subseteq \mathcal{C}$.

Since $\mathcal{C} - (D, E)$ follows from withdrawing some credibility objects from \mathcal{C} without adding anything, it is natural to think that $\mathcal{C} - (D, E)$ does not contain elements that do not belong to \mathcal{C} .

C3 – Safe retainment: $[T_1, D] \in \mathcal{C} - T_2$ if and only if $[T_1, D]$ is a safe element with respect to T_2 in \mathcal{C} .

The credibility objects which prevail after contraction will be the objects that are *safe objects* before the contraction, similarly to [2].

C4 – Soundness: if \mathcal{C} is sound then $\mathcal{C} - (D, E)$ is sound.

Since contraction is basically a process of elimination, this operation should not introduce cycles. This postulate is related with C2 as it is shown in the following proposition.

Proposition 2. For sound credibility bases, if a contraction operator satisfies C2 – Inclusion then it satisfies C4 – Soundness.

Proof. Straightforward. \square

We have not included a postulate similar to uniformity as was introduced by Hansson [24]. The reason is that an adaptation to our approach would be as the following: if for all $\mathcal{C}' \subseteq \mathcal{C}$, $(D, E) \in Cl(\mathcal{C}')$ if and only if $(F, G) \in Cl(\mathcal{C}')$ then $\mathcal{C} - (D, E) = \mathcal{C} - (F, G)$; but, since contraction receives a tuple and not a credibility object (see Remark 3) this statement will collapse to triviality as it is reflected in Proposition 3.

Proposition 3. Let $D, E, F, G \in \mathbb{A}$, $\mathcal{C} \in \mathcal{C}$. If for all subsets \mathcal{C}' of \mathcal{C} , $(D, E) \in Cl(\mathcal{C}')$ if and only if $(F, G) \in Cl(\mathcal{C}')$ then $(D, E) = (F, G)$.

Proof. See Appendix A. \square

5.2. Construction

In this section, we introduce the construction of the contraction operator for credibility bases, called C-contraction using reliability (or C_R -contraction for short). Consider again Example 3 where all the paths from A_1 to A_4 are shown. It is clear from Remark 2 that for the contraction of \mathcal{C}^B by (A_1, A_4) we need to eliminate at least one credibility object in every path

of $\mathcal{C}^B_{(A_1-A_4)}$. In other words, we need to eliminate a set of credibility objects from \mathcal{C}^B so that no path is left from A_1 to A_4 in the new credibility base.

The \mathcal{C}_R -contraction operator that we will define below is based on the contraction of a credibility order by a credibility tuple (A, B) proposed in [47]. That proposal uses a mechanism, based on [25], to decide which tuples are erased from each path from A to B . Next, this mechanism is adapted for a credibility base.

Definition 10 (*Cut function*). Let \mathcal{C} be a credibility base, a *cut function* σ for \mathcal{C} is a function such that for all $(A, B) \in Cl(\mathcal{C})$:

1. $\sigma(\mathcal{C}_{(A-B)}) \subseteq \bigcup \mathcal{C}_{(A-B)}$.
2. For each $P \in \mathcal{C}_{(A-B)}$, $P \cap \sigma(\mathcal{C}_{(A-B)}) \neq \emptyset$.

Definition 10 does not specify how the cut function selects the credibility objects that are being discarded from each path; this matter will be addressed using the reliability of the credibility tuples. Thus, the *cut function* will select the least reliable credibility objects of each path.

Given a set P of credibility objects, the following function returns all the credibility objects that are associated with identifiers which are not more credible than other identifier associated with a credibility object in P .

Definition 11 (*Minimal sources function*). $min_{\mathcal{C}} : \mathbb{C} \rightarrow \mathbb{C}$, is a function such that for a given credibility base $\mathcal{C} \in \mathbb{C}$ and $P \subseteq \mathcal{C}$,

$$min_{\mathcal{C}}(P) = \{[T, X] : [T, X] \in P \text{ and for all } [T', Y] \in P, (Y, X) \notin Cl(\mathcal{C})\}$$

Definition 12 (*Bottom cut function*). Given a paths set $\mathcal{C}_{(A-B)}$, σ_{\downarrow} is a *bottom cut function* if it is a cut function for \mathcal{C} such that

$$\sigma_{\downarrow}(\mathcal{C}_{(A-B)}) = \bigcup_{P \in \mathcal{C}_{(A-B)}} min_{\mathcal{C}}(P)$$

Example 6. Consider the credibility base of agent B of **Example 2** and the paths set $\mathcal{C}^B_{(A_1-A_4)} = \{P_1, P_2, P_3\}$ obtained in **Example 3**. As stated in **Definition 12**, $\sigma_{\downarrow}(\mathcal{C}^B_{(A_1-A_4)})$ will contain those elements from each path whose associated identifier is not greater than any other in the path. Hence, in path P_1 the selected credibility object is $[(A_1, A_2), F_1]$ because F_1 is less credible than F_3 ; in path P_2 the selected credibility object is $[(A_2, A_4), B]$; and in path P_3 is $[(A_1, A_3), F_1]$. Therefore, $\sigma_{\downarrow}(\mathcal{C}^B_{(A_1-A_4)}) = \{[(A_1, A_2), F_1], [(A_2, A_4), B], [(A_1, A_3), F_1]\}$.

Note that, the cut function can select more than one object from a single path when the reliability of the selected objects is incomparable. In particular, if all the agents associated with the credibility objects in a path are incomparable, then, the bottom cut function selects all of them. Observe that we use the credibility base itself to decide which information prevails. Then, we avoid to have a separate data structure maintaining the measure of reliability. Next, the \mathcal{C}_R -contraction operator, denoted $\Theta_{\sigma_{\downarrow}}$, is introduced.

Definition 13 (\mathcal{C}_R -contraction). Let $\mathcal{C} \in \mathbb{C}$, (A, B) a credibility tuple, $\mathcal{C}_{(A-B)}$ a paths set, and let σ_{\downarrow} be a bottom cut function for $\mathcal{C}_{(A-B)}$. The operator “ $\Theta_{\sigma_{\downarrow}}$ ”, called C-contraction using reliability or \mathcal{C}_R -contraction, is defined as follows:

$$\mathcal{C}\Theta_{\sigma_{\downarrow}}(A, B) = \mathcal{C} \setminus \sigma_{\downarrow}(\mathcal{C}_{(A-B)})$$

Example 7. Consider the credibility base in **Example 2**, $\mathcal{C}^B = \{[(B, F_1), F_2], [(F_1, F_2), F_3], [(F_2, F_3), B], [(A_1, A_2), F_1], [(A_1, A_3), F_1], [(A_2, A_4), B], [(A_2, A_4), F_3], [(A_3, A_4), F_2]\}$. Then, suppose B wants to reflect that the advisor A_1 is no longer less credible than the advisor A_4 . That is, B wants to effect a contraction by the credibility tuple (A_1, A_4) using “ $\Theta_{\sigma_{\downarrow}}$ ”. As showed in **Example 6**, $\sigma_{\downarrow}(\mathcal{C}^B_{(A_1-A_4)}) = \{[(A_1, A_2), F_1], [(A_2, A_4), B], [(A_1, A_3), F_1]\}$. Hence, $\mathcal{C}^B\Theta_{\sigma_{\downarrow}}(A_1, A_4) = \mathcal{C}^B \setminus \sigma_{\downarrow}(\mathcal{C}^B_{(A_1-A_4)}) = \{[(B, F_1), F_2], [(F_1, F_2), F_3], [(F_2, F_3), B], [(A_2, A_4), F_3], [(A_3, A_4), F_2]\}$. **Fig. 4** shows (left) the graph for the original credibility base \mathcal{C}^B and (right) the graph for the resulting credibility base after the contraction by (A_1, A_4) where three arcs have been deleted.

Next, we introduce the *Representation Theorem* for this new contraction operator (C-contraction using reliability “ $\Theta_{\sigma_{\downarrow}}$ ”). This theorem proves the correspondence between the set of postulates and the construction.

Theorem 1. Given $\mathcal{C} \in \mathbb{C}$, “ $\Theta_{\sigma_{\downarrow}}$ ” is a C-contraction using reliability for \mathcal{C} if and only if it satisfies success (C1), inclusion (C2), and safe retainment (C3).

Proof. See [Appendix A](#). \square

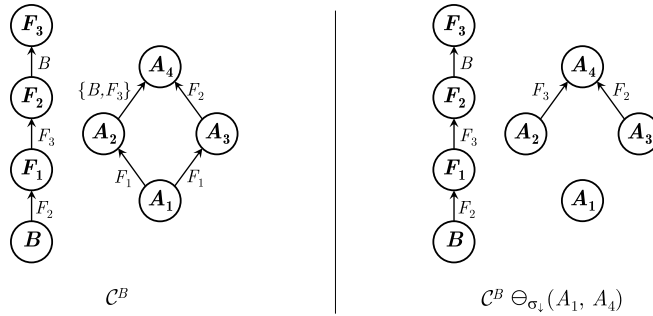


Fig. 4. Contraction using reliability.

The principle of minimal change is an accepted policy in the belief change research community; that is, beliefs should be given up only when one is forced to do so, and even in that situation, as few of them as possible should be given up [27]. In the present formalism, if some particular information (tuple) must be abandoned then all the credibility objects containing that tuple should be erased to achieve that, and that is the minimal possible characterization of the effect. Although our contraction operator can produce a change that is not minimal with respect to the number of credibility objects in the credibility base \mathcal{C} , the change is minimal as discussed in [27].

6. Prioritized revision operator using reliability

In the existing literature, several prioritized methods for sentences can be found, e.g., *partial meet revision* [1] and *kernel revision from kernel contraction* [25]. In these methods, the new information has priority over the beliefs in the base of the receiver agent.

In this section, following [25], we will define a new prioritized revision operator for credibility bases. This operator makes use of the safe element idea introduced for contraction at the beginning of the previous section, considered now in the context of revision. We will show first the postulates of this operator, then its construction, and finally the representation theorem.

6.1. Postulates for the prioritized revision operator

Let $D, E, F, G, H, I \in \mathbb{A}$, let $\mathcal{C} \in \mathbb{C}$ be a sound credibility bases, and let $T \in \mathbb{A} \times \mathbb{A}$ be a credibility tuple. We will use “ $*$ ” to denote a general prioritized revision operator, and we will propose the following postulates for prioritized revision.

PR1 – Success: $[T, D] \in \mathcal{C}*[T, D]$.

Since the revision operator defined here is considered prioritized (the new information has priority), the first postulate establishes that the revision should be successful. That is, the result of revising a credibility base \mathcal{C} by a credibility object $[T, D]$ should be a new credibility base that contains $[T, D]$.

PR2 – Inclusion: $\mathcal{C}*[T, D] \subseteq \mathcal{C} \cup \{[T, D]\}$.

This postulate states that besides $[T, D]$ no other element will be added upon revision of \mathcal{C} by $[T, D]$.

PR3 – Soundness: if \mathcal{C} is sound then $\mathcal{C}*[T, D]$ is sound.

This postulate guarantees that soundness is preserved in the resulting revised credibility base.

PR4 – Uniformity: $\mathcal{C} \cap (\mathcal{C}*[T, D]) = \mathcal{C} \cap (\mathcal{C}*[T, E])$.

This postulate establishes that $\mathcal{C}*[T, D]$ preserves from \mathcal{C} the same credibility objects as $\mathcal{C}*[T, E]$.

PR5 – Safe retainment: $[(D, E), F] \in \mathcal{C}*((G, H), I)$ if and only if $[(D, E), F]$ is a safe element with respect to (H, G) in \mathcal{C} .

The prevailing credibility objects after revision will be the objects that are *safe objects* before the revision, similarly to [2].

6.2. Construction

Next, we will give a construction of the prioritized revision operator for credibility bases, called \mathcal{C} -revision using reliability (or \mathcal{C}_R -revision for short), denoted “ \otimes_{σ_1} ”. Consider an agent that has a credibility base \mathcal{C} , and that the agent receives the information $[(A, B), S]$, that is, A is less credible than B . The basic task of our prioritized operator is to construct a new credibility base in which $(A, B) \in Cl(\mathcal{C})$ but $(B, A) \notin Cl(\mathcal{C})$. When a credibility base $\mathcal{C} \in \mathbb{C}$ is revised by a credibility object $[(A, B), S]$ there exist two tasks:

1. to maintain the soundness of \mathcal{C} . If $(B, A) \in Cl(\mathcal{C})$ (i.e., the addition of (A, B) generates a cycle in the new credibility base), then is necessary to erase some credibility objects from \mathcal{C} to avoid cycles.

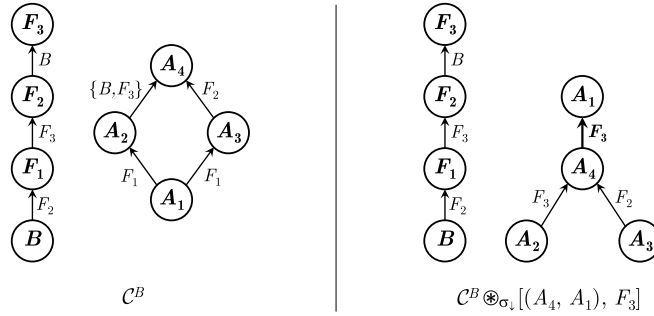


Fig. 5. Prioritized revision using reliability.

2. to add $[(A, B), S]$ to \mathcal{C} . As shown above, if $(A, B) \in Cl(\mathcal{C})$ then this operation might also increase the reliability of (A, B) .

The first task can be accomplished contracting by (B, A) . The second task can be accomplished expanding by $[(A, B), S]$. This composition is based on the *Levi identity* [34,22,1], which proposes that a revision can be constructed out of two operations: a contraction and an expansion.

Definition 14 (*Prioritized C-revision using reliability*). Let $\mathcal{C} \in \mathbb{C}$, $[(A, B), S]$ a credibility object, $\ominus_{\sigma_{\downarrow}}$ our C_R -contraction operator and \oplus our C_R -expansion operator. The operator “ $\otimes_{\sigma_{\downarrow}}$ ”, called prioritized C-revision using reliability or C_R -revision, is defined as follows:

$$\mathcal{C} \otimes_{\sigma_{\downarrow}} [(A, B), S] = (\mathcal{C} \ominus_{\sigma_{\downarrow}} (B, A)) \oplus [(A, B), S]$$

The representation theorem for this new proposed prioritized revision operator $\otimes_{\sigma_{\downarrow}}$ is introduced below. This theorem proves the correspondence between postulates and construction.

Theorem 2. Given $\mathcal{C} \in \mathbb{C}$, “ $\otimes_{\sigma_{\downarrow}}$ ” is a prioritized revision using reliability for \mathcal{C} if and only if it satisfies success (PR1), inclusion (PR2), soundness (PR3), uniformity (PR4), and safe retainment (PR5).

Proof. See Appendix A. \square

The following proposition establishes the relation among contraction, expansion, and prioritized revision.

Proposition 4. If “ \oplus ” satisfies E1, E2, E3, E4, E5 and E6, and “ $\ominus_{\sigma_{\downarrow}}$ ” satisfies C1, C2 and C3, then “ $\otimes_{\sigma_{\downarrow}}$ ” satisfies PR1, PR2, PR3, PR4, and PR5.

Proof. See Appendix A. \square

Example 8. Consider the credibility base of Example 2, $\mathcal{C}^B = \{[(B, F_1), F_2], [(F_1, F_2), F_3], [(F_2, F_3), B], [(A_1, A_2), F_1], [(A_1, A_3), F_1], [(A_2, A_4), B], [(A_2, A_4), F_3], [(A_3, A_4), F_2]\}$. Then, suppose that the fellow worker F_3 tells B that, in his opinion, the advisor A_4 is less credible than the advisor A_1 . That is to say, B has to revise by $[(A_4, A_1), F_3]$ using “ $\otimes_{\sigma_{\downarrow}}$ ”. Since $(A_1, A_4) \in Cl(\mathcal{C}^B)$ then it is first necessary to contract \mathcal{C}^B by (A_1, A_4) as shown in Example 7, and then to expand $\mathcal{C}^B \ominus_{\sigma_{\downarrow}} (A_1, A_4)$ by $[(A_4, A_1), F_3]$. Thus, $\mathcal{C}^B \otimes_{\sigma_{\downarrow}} [(A_4, A_1), F_3] = \{[(B, F_1), F_2], [(F_1, F_2), F_3], [(F_2, F_3), B], [(A_2, A_4), F_3], [(A_3, A_4), F_2], [(A_4, A_1), F_3]\}$. Fig. 5 shows (left) the graph for the original credibility base \mathcal{C}^B of Example 2, and (right) the graph for the resulting credibility base after the revision by $[(A_4, A_1), F_3]$ where three arcs have been deleted, and a new arc from A_4 to A_1 was added.

7. Non-prioritized revision operator using reliability

A prioritized revision operator is characterized by the satisfaction of the success postulate by the operator; that is, the incoming information is always accepted, becoming a part of the beliefs of the agent. However, as is mentioned in [17], oftentimes this is an unrealistic feature since actual epistemic agents, when confronted with information that contradicts previous beliefs, choose to reject the recent arrival. For instance, in a multi-agent domain if the information comes from different sources, and these sources are not equally credible, a non-prioritized method could be more adequate. Several models of belief revision have been developed where either the new information is completely accepted or it is completely

rejected [26,39,28,12]. In the literature of uncertain evidence revision there exist other proposals that not just simply accept or reject the new information, for instance [17,9,38,32]. In this section, we define a non-prioritized operator which completely accepts or rejects the new information.

7.1. Postulates for the non-prioritized revision operator

Let $A, B, S \in \mathbb{A}$, $C \in \mathbb{C}$ be a credibility base, $T \in \mathbb{A} \times \mathbb{A}$ be a credibility tuple. We will use “ \odot ” to denote a general non-prioritized revision operator, and we will propose the following postulates for non-prioritized revision.

NPR1 – Relative success: $C \odot [T, S] = C$ or $[T, S] \in C \odot [T, S]$.

This postulate, inspired by [28], says that all or nothing is accepted.

NPR2 – Weak success: if $(B, A) \notin Cl(C)$ then $[(A, B), S] \in C \odot [(A, B), S]$.

This postulate establishes that $[(A, B), S]$ is accepted in the revised credibility base if there is no path in C from B to A .

NPR3 – Conditional success: $[(A, B), S] \in C \odot [(A, B), S]$ when for all objects $[(D, E), F]$ that are not safe with respect to (B, A) in C it holds that $(F, S) \in Cl(C)$.

Observe that both NPR1 and NPR2 do not consider the reliability of credibility objects. Nevertheless, NPR3 establishes that a credibility object is accepted when its informant is *sufficiently credible*. That is, the input will be accepted when the informants of those elements that are not safe with respect to (B, A) in C are less credible than the informant of the new incoming tuple (A, B) .

NPR4 – Inclusion: $C \odot [T, D] \subseteq C \cup \{[T, D]\}$.

This postulate states that besides $[T, D]$ no element will be added upon revision of C by $[T, D]$.

NPR5 – Soundness: if C is sound then $C \odot [T, D]$ is sound.

This postulate guarantees that soundness is preserved in the revised credibility base.

NPR6 – Uniformity: If it holds that $[T, D] \in C \odot [T, D]$ if and only if $[T, E] \in C \odot [T, E]$, then $C \cap (C \odot [T, D]) = C \cap (C \odot [T, E])$.

Given a tuple T and two informant agents D and E , if $[T, D]$ is accepted in the revised base whenever $[T, E]$ is accepted in the revised base, then $C \odot [T, D]$ and $C \odot [T, E]$ preserve the same credibility objects.

NPR7 – Safe retainment: If $[(G, H), I] \in C \odot [(G, H), I]$ then $[(D, E), F] \in C \odot [(G, H), I]$ if and only if $[(D, E), F]$ is a safe element with respect to (H, G) in C .

The credibility objects which prevail after a revision by a credibility object accepted in the revised credibility base, will be the objects that are *safe objects* before the revision, similarly to [2].

7.2. Construction

This operator is based on the credibility ordering among agents represented as credibility bases. Consider that a credibility base C has to be revised by the credibility object $[(A, B), S]$. If (A, B) is *consistent* with $Cl(C)$, i.e., $(B, A) \notin Cl(C)$, then an expansion of C will occur. However, if inconsistency arises, i.e., $(B, A) \in Cl(C)$, then the proper credibility base (no other structure is necessary) is used to decide which information prevails. In our approach, $[(A, B), S]$ cannot be accepted when C contains more reliable tuples contradicting (A, B) . Thus, an analysis about reliability of tuples is needed. To obtain the reliability of the credibility tuple (B, A) , all paths from B to A have to be considered. Since we take a cautious approach, in each path we will consider those tuples whose associated agent identifiers are *no more credible than other*. Then, to compute the reliability of a credibility tuple, we will use function min_C (Definition 11 given in Section 5) and below we will introduce the auxiliary function max_C .

Given a set P of credibility objects, the following function returns all the credibility objects that are associated with identifiers which are not less credible than other identifier associated with the credibility objects in P .

Definition 15 (Maximal sources function). $max_C : \mathbb{C} \rightarrow \mathbb{C}$, is a function such that for a given credibility base $C \in \mathbb{C}$ and $P \subseteq C$, $max_C(P) = \{[T, A] : [T, A] \in P \text{ and for all } [T', B] \in P, (A, B) \notin Cl(C)\}$.

Another auxiliary function denoted *Sources* is introduced next. This function takes a credibility base C and returns the set of agent identifiers which are sources of credibility objects that belong to C .

Definition 16 (Sources function). The function $Sources : \mathbb{C} \rightarrow 2^{\mathbb{A}}$ is such that $Sources(C) = \{A : \text{there is } T \in \mathbb{A} \times \mathbb{A} \text{ and } [T, A] \in C\}$, for a given credibility base $C \in \mathbb{C}$.

Example 9. For the C^B in Example 2 $Sources(C^B) = \{B, F_1, F_2, F_3\}$.

Based on a credibility base C , we will define a function $Rl((A, B), C)$ that given a credibility tuple $(A, B) \in Cl(C)$, returns a set of agent identifiers that represent the *reliability* of (A, B) with respect to C . Recall that the function *Sources* returns a set of agent identifiers (Definition 16) and that $C_{(A-B)}$ represents the set of all paths from A to B .

Definition 17 (*Reliability function*). The *reliability function*, $RI : (\mathbb{A} \times \mathbb{A}) \times \mathbb{C} \rightarrow 2^{\mathbb{A}}$, is a function such that for a given credibility base $\mathcal{C} \in \mathbb{C}$ and a credibility tuple $(A, B) \in Cl(\mathcal{C})$:

$$RI((A, B), \mathcal{C}) = Sources \left(\max_{\mathcal{C}} \left(\bigcup_{P \in \mathcal{C}_{(A-B)}} \min_{\mathcal{C}}(P) \right) \right)$$

Note that the function RI requires that (A, B) be in $Cl(\mathcal{C})$, and therefore $\mathcal{C}_{(A-B)} \neq \emptyset$ (see [Remark 2](#)). Observe also that the function $\max_{\mathcal{C}}$ can return more than one agent identifier, therefore RI can return a set of pairwise incomparable agents (see [Examples 12 and 13](#)). Below, we show how RI is used in our non-prioritized operator to analyze the input and decide if the input is rejected or accepted. First, we show how RI works with our running example.

Example 10. Consider the credibility base of agent B given in [Example 2](#), $\mathcal{C}^B = \{[(B, F_1), F_2], [(F_1, F_2), F_3], [(F_2, F_3), B], [(A_1, A_2), F_1], [(A_1, A_3), F_1], [(A_2, A_4), B], [(A_2, A_4), F_3], [(A_3, A_4), F_2]\}$. Suppose that agent B needs to calculate the reliability of the credibility tuple (A_1, A_4) . Next, we show the paths set from A_1 to A_4 in \mathcal{C}^B (according to [Example 3](#)) and the application of the function $\min_{\mathcal{C}^B}$ to each path in the paths set. $\mathcal{C}^B_{(A_1-A_4)} = \{P_1, P_2, P_3\}$, where:

$$\begin{aligned} P_1 &= \{[(A_1, A_2), F_1], [(A_2, A_4), F_3]\} \\ P_2 &= \{[(A_1, A_2), F_1], [(A_2, A_4), B]\} \\ P_3 &= \{[(A_1, A_3), F_1], [(A_3, A_4), F_2]\} \\ \min_{\mathcal{C}^B}(P_1) &= \{[(A_1, A_2), F_1]\} \\ \min_{\mathcal{C}^B}(P_2) &= \{[(A_2, A_4), B]\} \\ \min_{\mathcal{C}^B}(P_3) &= \{[(A_1, A_3), F_1]\} \end{aligned}$$

Then, $\max_{\mathcal{C}^B}(\{[(A_1, A_2), F_1], [(A_2, A_4), B], [(A_1, A_3), F_1]\}) = \{[(A_1, A_2), F_1], [(A_1, A_3), F_1]\}$. From this set, the set containing the agent identifiers is obtained through the function $Sources$, $Sources(\{[(A_1, A_2), F_1], [(A_1, A_3), F_1]\}) = \{F_1\}$. Then, $RI((A_1, A_4), \mathcal{C}^B) = \{F_1\}$.

Definition 18 (*Non-prioritized C-revision using reliability*). Let \mathcal{C} be a credibility base in \mathbb{C} , and $[(A, B), S]$ a credibility object. Let \otimes_{σ_1} be a prioritized \mathcal{C}_R -revision operator and \oplus the \mathcal{C}_R -expansion operator. The operator “ \odot_{σ_1} ”, called non-prioritized \mathcal{C}_R -revision, is defined as follows:

$$\mathcal{C} \odot_{\sigma_1} [(A, B), S] = \begin{cases} \mathcal{C} \oplus [(A, B), S] & \text{if } (B, A) \notin Cl(\mathcal{C}) \\ \mathcal{C} \otimes_{\sigma_1} [(A, B), S] & \text{if } (B, A) \in Cl(\mathcal{C}) \text{ and } \forall X \in RI((B, A), \mathcal{C}), (X, S) \in Cl(\mathcal{C}) \\ \mathcal{C} & \text{otherwise} \end{cases}$$

The first case in [Definition 18](#) states that when no contradiction arises the input is accepted and added (expansion). The second case states that if a contradiction arises ($(B, A) \in Cl(\mathcal{C})$) then the input will be accepted and added if every agent returned by $RI((B, A), \mathcal{C})$ is less credible than S . The third case states that the input is rejected when there exists some agent identifier returned by RI that is incomparable with S or more credible than S .

The following proposition establishes a relation between this non-prioritized revision operator \odot_{σ_1} and the postulates presented.

Proposition 5. Given $\mathcal{C} \in \mathbb{C}$, if “ \odot_{σ_1} ” is a non-prioritized revision operator using reliability for \mathcal{C} then “ \odot_{σ_1} ” satisfies relative success (NPR1), weak success (NPR2), conditional success (NPR3), inclusion (NPR4), soundness (NPR5), uniformity (NPR6), and safe retainment (NPR7).

Proof. See [Appendix A](#). \square

Below, we include some examples to show how the non-prioritized operator works in different scenarios. First, our running example is used to show a simple case where RI returns a singleton.

Example 11. Consider the credibility base \mathcal{C}^B given in [Example 10](#). Suppose first that \mathcal{C}^B has to be revised by $[(A_4, A_1), B]$ using “ \odot_{σ_1} ”. According to [Example 10](#), $RI((A_1, A_4), \mathcal{C}^B) = \{F_1\}$. Since $(F_1, B) \notin Cl(\mathcal{C}^B)$, the operator rejects the input according to the third case of the definition of “ \odot_{σ_1} ”.

Consider now that the input is $[(A_4, A_1), F_3]$. Since $RI((A_1, A_4), \mathcal{C}^B) = \{F_1\}$ and $(F_1, F_3) \in Cl(\mathcal{C}^B)$, then the input is accepted and $\mathcal{C}^B \odot_{\sigma_1} [(A_4, A_1), F_3] = \mathcal{C}^B \otimes_{\sigma_1} [(A_4, A_1), F_3] = \{[(B, F_1), F_2], [(F_1, F_2), F_3], [(F_2, F_3), B], [(A_2, A_4), F_3], [(A_3, A_4), F_2], [(A_4, A_1), F_3]\}$.

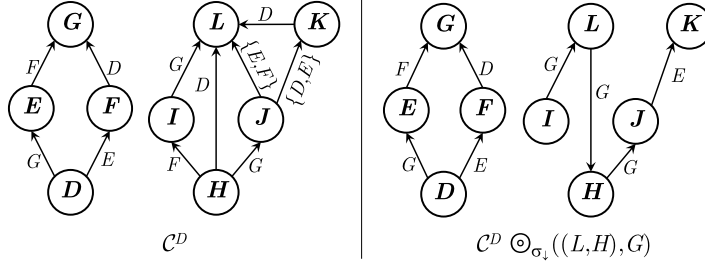


Fig. 6. Non-prioritized revision using reliability of Example 13.

Next, we introduce two examples where the set returned by RI contains more than one informant. In Example 12 the input is rejected whereas in Example 13 the input is accepted.

Example 12. Consider $C = \{(D, B), A\}, \{(B, E), H\}, \{(D, E), F\}, \{(A, H), E\}, \{(A, G), B\}$, and the input $\{(E, D), G\}$. Then, $RI((D, E), C) = \{A, F\}$. Since $(F, G) \notin Cl(C)$, the operator rejects the input (third case of Definition 18).

Example 13. Consider the credibility base of agent D , shown in Fig. 6. $C^D = \{(H, I), F\}, \{(H, L), D\}, \{(H, J), G\}, \{(I, L), G\}, \{(J, L), E\}, \{(J, K), D\}, \{(J, K), E\}, \{(K, L), D\}, \{(D, E), G\}, \{(D, F), E\}, \{(E, G), F\}, \{(F, G), D\}$.

Suppose that agent D receives the credibility object $\{(L, H), G\}$. Then, to obtain $RI((H, L), C^D)$ six paths from H to L have to be considered: $C^D_{(H-L)} = \{P_1, P_2, P_3, P_4, P_5, P_6\}$ where

$$\begin{aligned} P_1 &= \{[(H, L), D]\} & P_4 &= \{[(H, J), G], [(J, L), F]\} \\ P_2 &= \{[(H, I), F], [(I, L), G]\} & P_5 &= \{[(H, J), G], [(J, K), D], [(K, L), D]\} \\ P_3 &= \{[(H, J), G], [(J, L), E]\} & P_6 &= \{[(H, J), G], [(J, K), E], [(K, L), D]\} \end{aligned}$$

Thus, $\max_{C^D}(\bigcup_{P \in C^D_{(H-L)}} \min_{C^D}(P)) = \{(H, I), F\}, \{(J, L), E\}, \{(J, L), F\}$, and then, $RI((H, L), C^D) = \{E, F\}$ (E and F are incomparable). Since $(E, G) \in Cl(C^D)$ and $(F, G) \in Cl(C^D)$, then the input is accepted (second case of Definition 18), and $C^D \odot_{\sigma_1} \{(L, H), G\} = C^D \ast_{\sigma_1} \{(L, H), G\} = \{(H, J), G\}, \{(I, L), G\}, \{(J, K), E\}, \{(L, H), G\}, \{(D, E), G\}, \{(D, F), E\}, \{(E, G), F\}, \{(F, G), D\}$.

Following NPR3, in Example 12 the input is not accepted because in the credibility object $\{(D, E), F\}$ the informant is not less credible than the informant of the input. Nevertheless, in Example 13 the input is accepted because all the withdrawn information has an informant less credible than G .

Note that operators are defined following the *constructive* and *black box* approaches. In the constructive approach a concrete mechanism for change is explicitly defined, and in the black box approach, the properties that an operator should satisfy are specified regardless of how it is actually built [27]. Representation theorems connect the two approaches improving our understanding of the constructions and the postulates. It is important to note that we proved representation theorems just for contraction and prioritized revision because they need the specification of a “selection mechanism” that represents a criteria to define which credibility objects are preserved or discarded. Non-prioritized revision is not fully characterized. The complete characterization is subject of future work.

8. Related work

The areas of Trust and Multi-Source Belief Revision (MSBR) have produced research that is relevant to the present work. Still, to the best of our knowledge, the investigation presented here represents a novel contribution combining aspects of both. Next, we will comment on some related works in each of these two areas.

Different formalisms have been proposed to deal with multi-agent belief revision (MABR) [35,36,30,40] where the overall (global) belief revision of a team of agents is investigated. In contrast to those works, we focused on MSBR in which each agent maintains the consistency of its own belief base. Two other approaches that formalize a kind of MSBR are [10] and [15]. Similarly to our work, they both consider that the credibility of the source affects the reliability of incoming information, and this reliability is used in making decisions. However, these two approaches differ from ours in several important aspects that we discuss below.

We have identified two types of MSBR: *Unitary MSBR* and *Conjunctive MSBR*. Our work is focused on Unitary MSBR, assuming that the epistemic input is a credibility object, i.e., a credibility tuple provided by some informant. There are other works focused in conjunctive Belief Revision; for instance, in [21,19,20] the epistemic input is a set of beliefs. In these works, axiomatic representation is proposed where there is no consideration of the origin of every belief. Other forms of change operators that we may identify as conjunctive MSBR are present in the social contraction operators introduced by Booth [7].

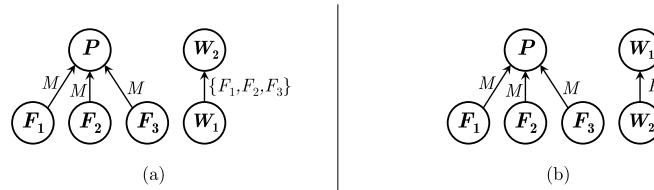


Fig. 7. (a) Credibility base C^M of Example 14 and (b) $C^M \odot_{\sigma_1} [(W_2, W_1), P]$.

The merging operators of Konieczny and Pino Pérez represent another example where multiple sources of information need to be confronted; for instance, in a committee in which not all the participants have the same weight in reaching a decision, it is necessary to weight each belief base to reflect this situation [31].

In [10], a set of incoming information from a particular source (called *scenario*) is treated as a whole and not sentence by sentence; therefore, it can be inconsistent. A relation of trustworthiness is introduced over sets of sources and not among single sources. In contrast to our approach, in that work a total order of sources is assumed, and when more than one source provides the same piece of information α , and a single agent gives $\neg\alpha$, then α will be preferred, that is, the decision is based on majority.

As we previously observed, using majority in decisions can be very useful in many situations, but can lead to erroneous or non-intuitive results in others. For instance, let us consider Example 14 below.

Example 14. Consider the set of agents $\mathbb{A} = \{P, F_1, F_2, F_3, M, W_1, W_2\}$, where P is a pediatrician, F_1, F_2, F_3 are participants of an internet forum dedicated to comment on children's health, and W_1, W_2 are two Pediatric sources. Consider now that the credibility base of M is $C^M = \{[(F_1, P), M], [(F_2, P), M], [(F_3, P), M], [(W_1, W_2), F_1], [(W_1, W_2), F_2], [(W_1, W_2), F_3]\}$ (see Fig. 7(a)). That is, agent M considers the participants of the internet forum are all less credible than the pediatrician P , and F_1, F_2, F_3 consider that W_1 is less credible than W_2 . Now consider that M receives the credibility object $[(W_2, W_1), P]$, i.e., the pediatrician informs M that in his opinion W_2 is less credible than W_1 . In an approach based on majority the opinion of F_1, F_2, F_3 will prevail and no change occurs. Nevertheless, in our approach, since it is based on more reliable grounds, the new information will prevail and C^M will be revised (see Fig. 7(b)): $C^M \odot_{\sigma_1} [(W_2, W_1), P] = \{[(F_1, P), M], [(F_2, P), M], [(F_3, P), M], [(W_2, W_1), P]\}$.

In [10], the order in which new information is obtained is not taken in consideration; but, in our approach the order in which beliefs are considered is important. On one hand, if the prioritized operator is used, then the newest information is always accepted. On the other hand, when the non-prioritized revision operator is used, if an agent receives a credibility tuple (A, B) and later receives (B, A) and both have the same reliability, then (B, A) will be rejected.

In Dragoni et al. [15], additional information is associated to each sentence in a tuple; each tuple contains five elements: (Identifier, Sentence, OS, Source, Credibility), where OS (Origin Set) is used to record the assumption nodes upon which it really ultimately depends (as derived by a theorem prover). It is clear that their model maintains sentences, whereas our formalism maintains a base of credibility tuples representing a strict partial order among informants. In contrast to their approach, in our model the reliability is not explicitly stored; thus, in our approach when the reliability of some credibility tuple is needed (in the non-prioritized revision process), the *reliability function* is applied. As shown in Example 15, given a credibility tuple (A, B) , its reliability depends on the paths from A to B . Therefore, if one of the credibility objects in these paths changes, the reliability of (A, B) may change.

Example 15. Consider a set $\mathbb{A} = \{D, E, F, G\}$ where the credibility base of agent D is $C^D = \{[(D, E), F], [(E, F), G], [(F, G), E]\}$. By Definition 17, $Rl((D, F), C^D) = \{F\}$. Now, suppose that D receives the credibility object $[(D, E), G]$. Now $C^D = \{[(D, E), F], [(D, E), G], [(E, F), G], [(F, G), E]\}$ and D has two paths from D to F . Hence $Rl((D, F), C^D) = \{G\}$. Observe that the reliability of (D, F) has increased.

Dragoni et al. [15] considers that agents detect and store the minimally inconsistent subsets of their knowledge bases in tables, i.e., the *nogoods*. A *good* is a subset of the knowledge base that it is consistent (i.e., it is not a superset of a *nogood*), and if it is augmented with any sentence becomes inconsistent. In contrast with our proposal, they never remove beliefs to avoid a contradiction, they choose which is the preferred *good* in the knowledge base. That is, they do not propose any contraction or revision operators. Another difference with our approach is that in [15] the order of informants is considered total. It is clear that having a total order represents a strong assumption that even may not be natural in some application domains.

As in this work, Tamargo et al. [49] have introduced an epistemic model for MSBR that together with sentences considers meta-information representing the credibility of the belief's source. However, in contrast to the present approach, in that article informant agents were ranked using a fixed total order, and the order cannot be modified using incoming information from peers. The approach we have introduced in this paper can be considered as a complement of the mentioned formalism

because we have introduced operators handling the dynamics of the strict partial order among agents, making a step forward in the definition of a complete change theory over agents' trust.

Also, our approach differs from those that use real numbers for representing credibilities. For example, in Benferhat et al. [5], the epistemic state is represented by a possibility distribution which is a mapping from the set of classical interpretations, or worlds, to the real interval $[0, 1]$. Clearly, the use of partially ordered labels to identify the trust level is more general because it gives us the possibility of having some elements that are incomparable; in contrast, when real numbers are used a total order is forced upon the labels.

In [6], they present a way to revise partial orders, proposing a new definition of *faithful assignment* that was initially presented by Katsuno and Mendelzon [29]. They also propose an alternate set of postulates characterizing iterated revision operators of partially ordered information, providing a representation theorem for operators complying with these postulates. The paper discusses additional postulates for iterated belief revision ([13,8]) and proposes two alternate postulates aiming to characterize other types of iterated belief revision. The presentation is completed showing how the results apply to other operators for revising partially ordered information (revision with memory, possibilistic revision and natural belief revision). The main distinction with this research is that in our work we propose an approach to multi-source belief revision where the credibility assigned to informant agents can be revised using a criterion that uses reliability to select which information is eliminated upon revision. Besides that, we introduce a non-prioritized revision operator also based on the reliability of the information.

In Sabater and Sierra [44], a set of relevant aspects to classify trust models is introduced; they advance the idea that it is possible to classify trust models considering the information sources that they take into account to calculate trust values. Direct experience and witness information are traditional information sources used in computational trust models; there are two types of direct experience, the experience based on the direct interaction with a partner, and the experience based on the observed interaction of other members of the community. Witness information, also called *word-of-mouth* or indirect information, is the information that comes from other members of the community. Here, we have taken in consideration only two of these aspects: *information sources* and *trust reliability measure*; we consider witness information as an information source.

In [44], it is suggested that a reliable value and its relevance in the final decision making process is as important as the trust value itself. In our approach, we have introduced this type of information through the use of agent identifiers that represent the information sources, avoiding in that way the need of a separate data structure to maintain the measure of reliability.

Sabater and Sierra, in a previous work [43], in contrast with our proposal, present a model for reputation that takes into account what they call the *social dimension* and the *ontological dimension* of reputation. They show how the model relates to other systems and provide initial experimental results about the benefits of using a social view on the modeling of reputation.

In [47], change operators (expansion, contraction, and prioritized revision) for a credibility order (\mathcal{O}) were proposed. Nevertheless, in that work there are some important issues that have not been addressed and that we have solved in the present article. First, in [47] the model does not consider how reliable is the trust and the relevance it deserves in the final decision making process. Here, we have introduced the notion of *credibility base*. This type of base stores credibility tuples together with their associated information source representing the *reliability* for each piece of information. Second, in [47] the contraction operator does not specify how the cut function selects the credibility objects being discarded from each path. In the present approach, this was introduced through the use of the reliability of the credibility tuples; thus, the *cut function* selects the least reliability credibility objects of each path. Finally, in [47] the new information has always priority, situation that can be unrealistic in some scenarios (see [17,16]). In this article, we have defined a non-prioritized revision operator that uses a reliability criterion to decide if the new information is accepted or rejected. When information comes from different sources, and a preference among sources can be established, then a non-prioritized method could be adequate. In contrast, if an agent always acquires information from the same source, then a prioritized method could be more appropriated.

In a recent paper [37] the revision of partial pre-orders is considered. There, a partial pre-order representing the prior epistemic state can be revised with another partial pre-order which represents the new input. They propose four different prioritized revision strategies, and show that three of them produce the same revision result. The prioritized revision is recursively conducted on the individual units of partial pre-orders. In contrast to us, reliability values of the incoming information are not considered in the revision process. Since partial pre-orders are revised by a set of units, the revision result depends on the order in which the units from one set are inserted into the other set. Therefore, their revision process requires to produce different extensions, or permutations of the new input, and then to intersect them. In contrast to their approach, our proposal considers a multi-source belief revision setting where the revision process is guided by the credibility of information source and reliability of the stored information. Another difference is that we also propose a non-prioritized revision operator.

The framework developed in [41,42] considers the dynamics of trust. The author characterizes trust between two agents A and B , by saying that A trusts B if A is suspicious of the enemies of B . Suspicion is assigned a non negative integer, establishing a complete linear order between agents. Also, Nayak makes the simplifying assumption that the agent A considers the recommendations it receives from other reputable agents to be practically infallible, and A will disregard a recommendation from an unreliable agent. This framework is different from ours in several important points. In our approach,

the credibility order among agents is a partial order which allows for the possibility that two agents are unrelated, and, more significantly, in [41,42] maintains a global linear order whereas in our proposal the order is local to each agent. Furthermore in [41,42], they disregard information considering only the credibility of the input, whereas in our proposal we consider the complete credibility base of the agent. We do not disregard any information regarding credibility, but instead we keep a credibility base that always obtains the more credible information. Finally, we make no assumption as to how the credibility is assigned, allowing for the modeling of different approaches.

Other approaches [3,12] consider a combination of orders. However, our approach is focused on a multi-agent approach where every agent maintains its order and decides its preference individually.

Screened revision [39] is a way of effecting non prioritized revision where there is a pre-processing of the new information. In general terms, screened revision leads to one of two cases: (i) the screened revision results in a prioritized AGM revision if the new information is consistent with some set A which is a subset of the original set; or, (ii) the original set of beliefs remains unaltered. Makinson presented different possible constructions for screened revision without representation theorems. Hansson et al. generalized in [28] the idea of screened revision considering a set of credible sentences \mathcal{C} . This work presents different properties for \mathcal{C} , different constructions, and their respective representation theorems in epistemic models based on belief sets or possible worlds. Fermé et al. [18] extended the above proposal to an epistemic model based on belief bases. Our work, as the above mentioned approaches, defines a non prioritized revision operator on credibility bases making use of a pre-processing of the new information. However, unlike those proposals, it produces a new credibility base that can be changed (expanded, contracted, revised) since the new order is reconstructed. That is, our model is suitable for iteration.

Finally, in an approach that can be considered as relevant, Cholvy [11] studies the evaluation of a piece of information when successively reported by several sources. The paper describes a model for characterizing the plausibility of information when reported by several successive sources; this model is based on Dempster–Shafer’s theory where the reported information is attached a plausibility degree. This value depends on the degrees to which the sources are correct and the degrees to which they are wrong. This approach is different from ours in the theoretical level and in the formal tools used to model the evaluation of information. A consequence of attaching a plausibility degree to information is that the information becomes arranged as a total order; in contrast, we have allowed for the possibility that information could not be compared. From this point onwards, these two approaches become different. Furthermore, we have characterized the problem in the area of belief revision producing a formalism that follows the methodology of this area.

9. Conclusions and future work

The importance of having trust models has been emphasized in the literature. As stated in [44], two elements have contributed to substantially increase the interest on trust in this area: the multi-agent system paradigm and the spectacular evolution of e-commerce. The study of trust has many applications in Information and Communication Technologies. For instance, trust has been recognized as a key factor for successful electronic commerce adoption. These systems are used by intelligent software agents as a mechanism to search for trustworthy exchange partners and as an incentive in decision-making about whether or not to honor contracts. Our proposal can be applied to any system requiring that trust or credibility of informants be taken into account.

In this work, we have introduced a trust model for a multi-agent setting. In this model agents can share information representing trust assigned to its peers (called *witness information* in the literature). We have defined an epistemic model where credibility objects include not only trust information but also the informant source. These objects are maintained in a credibility base which represents a strict partial order among informant agents together with the source of the information. Thus, upon arrival of new information regarding the credibility of its peers, an agent will be capable of revising this strict partial order, and in this manner change the trust in its peers accordingly.

In this paper we have introduced four operators for credibility bases: expansion, contraction, prioritized and non-prioritized revision. The contraction operator uses the reliability stored in credibility objects for deciding which information prevails. Then, based on our contraction and expansion operators, a prioritized revision was defined using Levi identity. The non-prioritized revision operator uses the reliability of the input and the information stored in the credibility base in order to decide if the input is accepted or rejected. These operators provide the capability of dynamically modifying the credibility of informants to reflect a new perception of the informant’s trust, or when necessary to extend the set of informants by admitting the arrival of new informant agents. These four change operators were defined through construction and postulates.

Note that the operators were defined following the *constructive* and *black box* approaches. In the constructive approach, a concrete mechanism for change was explicitly defined, and in the black box approach, the properties that the operator should satisfy were specified regardless of how the operator will be built [27]. Representation theorems connected the two approaches improving our understanding of the constructions and the postulates. It is important to note that we have proved representation theorems only for contraction and prioritized revision because they need the specification of a “selection mechanism” that represents a criterion used to define which credibility objects are preserved or discarded. Non-prioritized revision is not fully characterized, and its complete characterization is subject of future work.

We will also consider the broadening of the results obtained here to deal with different *contexts*. In [44] they offer the following example to show that trust is context dependent: “if we trust a doctor when she is recommending a medicine it

does not mean we have to trust her when she is suggesting a bottle of wine”; here we have considered trust in a unique context. Our proposed model was designed to associate a single trust value per agent in the multi-agent system without taking into account the context. Since this last aspect has received little attention in the literature, as future research we propose to extend the results obtained here toward a multi-context model that will have the mechanisms to deal with several contexts simultaneously. Another research line we consider as future work is to extend our operators assuming that the epistemic input is a set of credibility objects $\{[T_1, A_1], \dots, [T_k, A_k]\}$ where T_i is a credibility tuple and A_i is the informant that provides T_i , for every $1 \leq i \leq k$.

In [Definition 3](#) we have established the restriction that in a credibility object $[T, S]$ the source S cannot appear in any place in T . The motivation for that decision is illustrated by the following example. Let $C^Q = \{(B, A), B\}$ be the credibility base of an agent Q , that is, agent B regards agent A as more credible than itself. Now consider the revision of C^Q by the credibility object $[(A, B), A]$ using the non-prioritized revision operator. The new information expresses that, according to agent A , agent B is more credible than itself. Using the information contained in C^Q the new information is accepted and the revised base should be $C^Q = \{(A, B), A\}$. This opens the question over if either the old information or the new information should be used for deciding acceptance or rejection.

However, from a positive point of view, there are particular situations where some interesting examples can be represented if the restriction is lifted. For instance, consider a situation where an agent A interacts with his doctor D . It is natural that D considers himself less credible than a specialist S in some medical topic; consequently, D can inform A the credibility object $[(D, S), D]$. Consider a situation involving two researchers A and B , and that A has read several articles written by B on a certain topic. Since A regards B as a specialist in the subject in question, he believes that he is less credible than B , i.e., $C^A = \{(A, B), A\}$, also A and B are in a situation where they interact with each other. Because B knows that A is well read, he knows that A has read not only his own publications but also is acquainted with other approaches; therefore, B considers that A is more credible than himself in that topic. Then, it is natural that now A accepts himself as more credible than B . If A receives the credibility object $[(B, A), B]$ then according to the non-prioritized operator the agent would accept the new information, and hence, $C^A = \{(B, A), B\}$. The discussion above, clearly motivates further research focussed in operators that are able to handle this more general situation.

Finally, it is interesting to observe the natural phenomenon of retransmission of information is related to our formalism. This was previously considered in the work presented in [\[33,48\]](#) using a different context. The research reported there can be adapted and expanded using the framework presented here. We will also explore the interesting issues related to this particular action in our future work.

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Appendix A

Proposition 3. Let $D, E, F, G \in \mathbb{A}, C \in \mathcal{C}$. If for all subsets C' of \mathcal{C} , $(D, E) \in Cl(C')$ if and only if $(F, G) \in Cl(C')$ then $(D, E) = (F, G)$.

Proof. By *reductio ad absurdum*. Suppose that $(D, E) \neq (F, G)$. Consider $C' = \{(D, E), X\}$ for some $X \in \mathbb{A}$. Therefore, $(D, E) \in Cl(C')$ and $(F, G) \notin Cl(C')$ showing that the supposition is untenable.

Before giving the proofs of the theorems, we introduce an auxiliary result that will be used in the proof of [Theorem 1](#) and [Theorem 2](#). This proposition is adapted from a property proposed in [\[27\]](#). \square

Proposition 6. Let $D, E, F, G \in \mathbb{A}, C \in \mathcal{C}, C_{(D-E)}$ the paths set from D to E in C and $C_{(F-G)}$ the paths set from F to G in C . $C_{(D-E)} = C_{(F-G)}$ if and only if for all subsets C' of \mathcal{C} : $(D, E) \in Cl(C')$ if and only if $(F, G) \in Cl(C')$.

Proof. By *reductio ad absurdum*.

(\Rightarrow) Suppose that there is some subset C' of \mathcal{C} such that $(D, E) \in Cl(C')$ and $(F, G) \notin Cl(C')$. Then, there is some path P of $C_{(D-E)}$ such that $P \subseteq C'$. Since $P \subseteq C'$ and $(F, G) \notin Cl(C')$, we have $(F, G) \notin Cl(P)$, so that $P \notin C_{(F-G)}$. Then $P \in C_{(D-E)}$ and $P \notin C_{(F-G)}$ contrary to $C_{(D-E)} = C_{(F-G)}$.

(\Leftarrow) Suppose that $C_{(D-E)} \neq C_{(F-G)}$. We may assume that there is some path $P \in C_{(D-E)}$ such that $P \notin C_{(F-G)}$. There are two cases:

- $(F, G) \notin Cl(P)$: then we have $(D, E) \in Cl(P)$ and $(F, G) \notin Cl(P)$, showing that the conditions of the proposition are not satisfied.
- $(F, G) \in Cl(P)$: then it follows from $P \notin C_{(F-G)}$ that there is some P' such that $P' \subset P$ and $(F, G) \in Cl(P')$. We then have $(F, G) \in Cl(P')$ and $(D, E) \notin Cl(P')$, showing that the conditions of the proposition are not satisfied. \square

Theorem 1. Given $C \in \mathcal{C}$, “ \ominus_{σ_i} ” is a C-contraction using reliability for C if and only if it satisfies success (C1), inclusion (C2), and safe retainment (C3).

Proof.

• *Postulates to construction.* We need to show that if an operator $(-)$ satisfies the enumerated postulates, then it is possible to build an operator in the way specified in the theorem $(\ominus_{\sigma_{\downarrow}})$.

- (i) Let “ σ_{\downarrow} ” be a function such that, for every credibility base $C \in \mathbb{C}$ and for every tuple (A, B) holds that $\sigma_{\downarrow}(C_{(A-B)}) = C \setminus C - (A, B)$.

We must show that:

- Part A.
 1. “ σ_{\downarrow} ” is a well defined function.
 2. $\sigma_{\downarrow}(C_{(D-E)}) \subseteq \bigcup(C_{(D-E)})$.
 3. For each $P \in \mathcal{C}_{(D-E)}$, $P \cap \sigma_{\downarrow}(C_{(D-E)}) \neq \emptyset$.
 4. If $[T_1, F] \in \sigma_{\downarrow}(C_{(D-E)})$ then $\exists P \in \mathcal{C}_{(D-E)}$ such that $[T_1, F] \in P$, and for all $[T_2, G] \in P$, $(G, F) \notin Cl(C)$.
- Part B. “ $\ominus_{\sigma_{\downarrow}}$ ” is equal to “ $-$ ”, that is, $C_{\ominus_{\sigma_{\downarrow}}}(D, E) = C - (D, E)$.

Proof of part A.

1. “ σ_{\downarrow} ” is a well defined function.

“ σ_{\downarrow} ” is defined over the whole domain. Let (D, E) and (F, G) be such that $C_{(D-E)} = C_{(F-G)}$. We need to show $\sigma_{\downarrow}(C_{(D-E)}) = \sigma_{\downarrow}(C_{(F-G)})$. It follows from $C_{(D-E)} = C_{(F-G)}$, by [Proposition 6](#), for all subsets C' of C , $(D, E) \in Cl(C')$ iff $(F, G) \in Cl(C')$. Thus, by [Proposition 3](#), $(D, E) = (F, G)$ and $C - (D, E) = C - (F, G)$. Then, following (i), $\sigma_{\downarrow}(C_{(D-E)}) = \sigma_{\downarrow}(C_{(F-G)})$.

2. $\sigma_{\downarrow}(C_{(D-E)}) \subseteq \bigcup(C_{(D-E)})$.

Let $T_2 = (D, E)$ and $[T_1, H] \in \sigma_{\downarrow}(C_{(D-E)})$. Following (i), $[T_1, H] \in C \setminus C - T_2$. Thus, $[T_1, H] \in C$ and $[T_1, H] \notin C - T_2$. It follows by **safe retainment** that $[T_1, H]$ is not a safe element with respect to T_2 in C . Then, there is some path in $C_{(D-E)}$ that contains $[T_1, H]$. Hence, $[T_1, H] \in \bigcup(C_{(D-E)})$.

3. For each $P \in \mathcal{C}_{(D-E)}$, $P \cap \sigma_{\downarrow}(C_{(D-E)}) \neq \emptyset$.

Let $\emptyset \neq P \in \mathcal{C}_{(D-E)}$, we need to show that $P \cap \sigma_{\downarrow}(C_{(D-E)}) \neq \emptyset$. We should prove that, there exists $[T_1, H] \in P$ such that $[T_1, H] \in \sigma_{\downarrow}(C_{(D-E)})$. Suppose $T_2 = (D, E)$, by **success**, $T_2 \notin Cl(C - T_2)$. Since $P \neq \emptyset$ then $T_2 \in Cl(P)$ and $P \not\subseteq C - T_2$; i.e., there is some $[T_1, H]$ such that $[T_1, H] \in P$ and $[T_1, H] \notin C - T_2$. Since $P \subseteq C$ it follows that $[T_1, H] \in (C \setminus C - T_2)$; i.e., by (i) $[T_1, H] \in \sigma_{\downarrow}(C_{(D-E)})$. Therefore, $P \cap \sigma_{\downarrow}(C_{(D-E)}) \neq \emptyset$.

4. If $[T_1, F] \in \sigma_{\downarrow}(C_{(D-E)})$ then $\exists P \in \mathcal{C}_{(D-E)}$ such that $[T_1, F] \in P$, and for all $[T_2, G] \in P$, $(G, F) \notin Cl(C)$.

Let $T_2 = (D, E)$ and suppose that $[T_1, F] \in \sigma_{\downarrow}(C_{(D-E)})$. Then, by (i), $[T_1, F] \in C \setminus C - T_2$. Thus, $[T_1, F] \in C$ and $[T_1, F] \notin C - T_2$. It follows by **safe retainment** that $[T_1, F]$ is not a safe element with respect to T_2 in C . Then, there is some path P in $C_{(D-E)}$ that contains $[T_1, F]$ and for all $[T_3, G] \in P$, $(G, F) \notin Cl(C)$.

Proof of part B. “ $\ominus_{\sigma_{\downarrow}}$ ” is equal to “ $-$ ”, that is, $C_{\ominus_{\sigma_{\downarrow}}}(D, E) = C - (D, E)$.

Let “ $\ominus_{\sigma_{\downarrow}}$ ” a C_R -contraction operator defined as $C_{\ominus_{\sigma_{\downarrow}}}(D, E) = C \setminus \sigma_{\downarrow}(C_{(D-E)})$ and σ_{\downarrow} defined as in (i).

(\supseteq) Let $[T_1, H] \in C - (D, E)$. It follows by **inclusion** that $C - (D, E) \subseteq C$ and $[T_1, H] \in C$. It follows from $[T_1, H] \in C - (D, E)$ and $[T_1, H] \in C$ that $[T_1, H] \notin (C \setminus C - (D, E))$. Thus, by (i), $[T_1, H] \notin \sigma_{\downarrow}(C_{(D-E)})$. Hence, $[T_1, H] \in C_{\ominus_{\sigma_{\downarrow}}}(D, E)$.

(\subseteq) Let $[T_1, H] \in C_{\ominus_{\sigma_{\downarrow}}}(D, E)$. By definition $[T_1, H] \in C \setminus \sigma_{\downarrow}(C_{(D-E)})$. Then, $[T_1, H] \in C$ and $[T_1, H] \notin \sigma_{\downarrow}(C_{(D-E)})$. Thus, by (i), $[T_1, H] \notin C \setminus C - (D, E)$. Hence, $[T_1, H] \in C - (D, E)$.

• *Construction to postulates.* Let $\ominus_{\sigma_{\downarrow}}$ be a C -contraction using reliability for C . We need to show that it satisfies the three conditions of the theorem.

(C1) *Success:* $(D, E) \notin Cl(C_{\ominus_{\sigma_{\downarrow}}}(D, E))$.

Proof. Suppose to the contrary that $(D, E) \in Cl(C_{\ominus_{\sigma_{\downarrow}}}(D, E))$. There is then a path $P \in \mathcal{C}_{(D-E)}$ such that $P \subseteq C_{\ominus_{\sigma_{\downarrow}}}(D, E)$. By [Remark 1](#), C is irreflexive and then $D \neq E$. Therefore, $P \neq \emptyset$. By clause (2) of [Definition 10](#), there is some $[T_1, F] \in P$ such that $[T_1, F] \in \sigma_{\downarrow}(C_{(D-E)})$. By [Definition 13](#), $[T_1, F] \notin (C_{\ominus_{\sigma_{\downarrow}}}(D, E))$, contrary to $[T_1, F] \in P$ with $P \subseteq C_{\ominus_{\sigma_{\downarrow}}}(D, E)$.

(C2) *Inclusion:* $C_{\ominus_{\sigma_{\downarrow}}}(D, E) \subseteq C$.

Proof. Straightforward by definition.

(C3) *Safe retainment:* $[T_1, D] \in C_{\ominus_{\sigma_{\downarrow}}}T_2$ if and only if $[T_1, D]$ is a safe element with respect to T_2 in C .

Proof.

(\Rightarrow) Suppose that $[T_1, D] \in C_{\ominus_{\sigma_{\downarrow}}}T_2$ with $T_2 = (E, F)$. Following [Definition 13](#), $[T_1, D] \in C \setminus \sigma_{\downarrow}(C_{(E-F)})$ and $[T_1, D] \notin \sigma_{\downarrow}(C_{(E-F)})$. Then, by [Definition 12](#), for every path P from E to F if $[T_1, D] \in P$ then $\exists[(I, J), K] \in P$ with $(K, D) \in Cl(C)$. Thus, $[T_1, D]$ is a safe element with respect to T_2 in C .

(\Leftarrow) Suppose that $[T_1, D]$ is a safe element with respect to T_2 in C with $T_2 = (E, F)$. Then, for every path $P \in \mathcal{C}_{(E-F)}$ either $[T_1, D] \notin P$, or $\exists[(I, J), K] \in P$ with $(K, D) \in Cl(C)$. Thus, following [Definition 12](#), $[T_1, D] \notin \sigma_{\downarrow}(C_{(E-F)})$. Hence, $[T_1, D] \in C \setminus \sigma_{\downarrow}(C_{(E-F)})$ and by [Definition 13](#) $[T_1, D] \in C_{\ominus_{\sigma_{\downarrow}}}T_2$. \square

Theorem 2. Given $\mathcal{C} \in \mathbb{C}$, “ $\otimes_{\sigma_{\downarrow}}$ ” is a prioritized revision using reliability for \mathcal{C} if and only if it satisfies success (PR1), inclusion (PR2), soundness (PR3), uniformity (PR4), and safe retainment (PR5).

Proof.

• *Postulates to construction.* We need to show that if an operator $(*)$ satisfies the enumerated postulates, then it is possible to build an operator in the way specified in the theorem ($\otimes_{\sigma_{\downarrow}}$).

(ii) Let “ σ_{\downarrow} ” be a function such that for every credibility base $\mathcal{C} \in \mathbb{C}$ and for every tuple (D, E) holds $\sigma_{\downarrow}(\mathcal{C}_{(E-D)}) = \mathcal{C} \setminus \mathcal{C} * [(D, E), F]$.

We must show that:

– Part A.

1. “ σ_{\downarrow} ” is a well defined function.

2. $\sigma_{\downarrow}(\mathcal{C}_{(E-D)}) \subseteq \bigcup (\mathcal{C}_{(E-D)})$.

3. For each $P \in \mathcal{C}_{(E-D)}$, $P \cap \sigma_{\downarrow}(\mathcal{C}_{(E-D)}) \neq \emptyset$.

4. If $[T_1, H] \in \sigma_{\downarrow}(\mathcal{C}_{(E-D)})$ then $\exists P \in \mathcal{C}_{(D-E)}$ such that $[T_1, H] \in P$, and for all $[T_2, I] \in P$, $(I, H) \notin Cl(\mathcal{C})$.

– Part B. “ $\otimes_{\sigma_{\downarrow}}$ ” is equal to “ $*$ ”, that is, $\mathcal{C} \otimes_{\sigma_{\downarrow}} [(D, E), F] = \mathcal{C} * [(D, E), F]$.

Proof of part A.

1. “ σ_{\downarrow} ” is a well defined function.

“ σ_{\downarrow} ” is defined over the whole domain. Let (E, D) and (G, F) be such that $\mathcal{C}_{(E-D)} = \mathcal{C}_{(G-F)}$. We need to show $\sigma_{\downarrow}(\mathcal{C}_{(E-D)}) = \sigma_{\downarrow}(\mathcal{C}_{(G-F)})$. It follows from $\mathcal{C}_{(E-D)} = \mathcal{C}_{(G-F)}$, by Proposition 6, for all subsets \mathcal{C}' of \mathcal{C} , $(E, D) \in Cl(\mathcal{C}')$ if and only if $(G, F) \in Cl(\mathcal{C}')$. Then, by Proposition 3, $(E, D) = (G, F)$. Thus, by **uniformity**, $\mathcal{C} \cap (\mathcal{C} * [(D, E), H]) = \mathcal{C} \cap (\mathcal{C} * [(F, G), I])$. Then, $\mathcal{C} \setminus (\mathcal{C} * [(D, E), H]) = \mathcal{C} \setminus (\mathcal{C} * [(F, G), I])$. Therefore, by (ii), $\sigma_{\downarrow}(\mathcal{C}_{(E-D)}) = \sigma_{\downarrow}(\mathcal{C}_{(G-F)})$.

2. $\sigma_{\downarrow}(\mathcal{C}_{(E-D)}) \subseteq \bigcup (\mathcal{C}_{(E-D)})$.

Let $[(F, G), H] \in \sigma_{\downarrow}(\mathcal{C}_{(E-D)})$. Following (ii), $[(F, G), H] \in \mathcal{C} \setminus \mathcal{C} * [(D, E), I]$. Thus, $[(F, G), H] \in \mathcal{C}$ and $[(F, G), H] \notin \mathcal{C} * [(D, E), I]$. It follows by **safe retainment** that $[(F, G), H]$ is not a safe element with respect to (E, D) in \mathcal{C} . Then, there is some path in $\mathcal{C}_{(E-D)}$ that contains $[(F, G), H]$. Hence, $[(F, G), H] \in \bigcup (\mathcal{C}_{(E-D)})$.

3. For each $P \in \mathcal{C}_{(E-D)}$, $P \cap \sigma_{\downarrow}(\mathcal{C}_{(E-D)}) \neq \emptyset$.

Let $\emptyset \neq P \in \mathcal{C}_{(E-D)}$, we need to show that $P \cap \sigma_{\downarrow}(\mathcal{C}_{(E-D)}) \neq \emptyset$. We should prove that, there exists $[T_1, G] \in P$ such that $[T_1, G] \in \sigma_{\downarrow}(\mathcal{C}_{(E-D)})$. Suppose $T_2 = (D, E)$. Since we have assumed that \mathcal{C} is sound, by **soundness**, $\mathcal{C} * [T_2, F]$ is a sound credibility base. Since $P \cup \{[T_2, F]\}$ is not sound then $P \not\subseteq \mathcal{C} * [T_2, F]$ by **success**. This means that there is some $[T_1, G] \in P$ and $[T_1, G] \notin \mathcal{C} * [T_2, F]$. Since $P \subseteq \mathcal{C}$ it follows that $[T_1, G] \in (\mathcal{C} \setminus \mathcal{C} * [T_2, F])$; i.e., by (ii) $[T_1, G] \in \sigma_{\downarrow}(\mathcal{C}_{(E-D)})$. Therefore, $P \cap \sigma_{\downarrow}(\mathcal{C}_{(E-D)}) \neq \emptyset$.

4. If $[T_1, H] \in \sigma_{\downarrow}(\mathcal{C}_{(E-D)})$ then $\exists P \in \mathcal{C}_{(D-E)}$ such that $[T_1, H] \in P$, and for all $[T_2, I] \in P$, $(I, H) \notin Cl(\mathcal{C})$.

Suppose that $[(F, G), H] \in \sigma_{\downarrow}(\mathcal{C}_{(E-D)})$. Then, by (ii), $[(F, G), H] \in (\mathcal{C} \setminus \mathcal{C} * [(D, E), L])$. Thus, $[(F, G), H] \in \mathcal{C}$ and $[(F, G), H] \notin \mathcal{C} * [(D, E), L]$. It follows by **safe retainment** that $[(F, G), H]$ is not a safe element with respect to (E, D) in \mathcal{C} . Then, there is some path P in $\mathcal{C}_{(E-D)}$ that contains $[(F, G), H]$ and for all $[(J, K), I] \in P$, $(I, H) \notin Cl(\mathcal{C})$.

Part B.

“ $\otimes_{\sigma_{\downarrow}}$ ” is equal to “ $*$ ”, that is, $\mathcal{C} \otimes_{\sigma_{\downarrow}} [(D, E), H] = \mathcal{C} * [(D, E), H]$.

Let “ $\otimes_{\sigma_{\downarrow}}$ ” a \mathcal{C}_R -revision operator defined as $\mathcal{C} \otimes_{\sigma_{\downarrow}} [(D, E), H] = (\mathcal{C} \setminus \sigma_{\downarrow}(\mathcal{C}_{(E-D)})) \cup \{[(D, E), H]\}$ and σ_{\downarrow} defined as in (ii).

(\supseteq) Let $[(F, G), I] \in \mathcal{C} * [(D, E), H]$. It follows by **inclusion** that $\mathcal{C} * [(D, E), H] \subseteq \mathcal{C} \cup \{[(D, E), H]\}$ and $[(F, G), I] \in \mathcal{C} \cup \{[(D, E), H]\}$. Then, $[(F, G), I] \in \mathcal{C}$. It follows from $[(F, G), I] \in \mathcal{C} * [(D, E), H]$ and $[(F, G), I] \in \mathcal{C}$ that $[(F, G), I] \notin (\mathcal{C} \setminus \mathcal{C} * [(D, E), H])$. Thus, by (ii), $[(F, G), I] \notin \sigma_{\downarrow}(\mathcal{C}_{(E-D)})$. Hence, $[(F, G), I] \in \mathcal{C} \otimes_{\sigma_{\downarrow}} [(D, E), H]$.

(\subseteq) Let $[(F, G), I] \in \mathcal{C} \otimes_{\sigma_{\downarrow}} [(D, E), H]$. By definition, $\mathcal{C} \otimes_{\sigma_{\downarrow}} [(D, E), H] \subseteq \mathcal{C} \cup \{[(D, E), H]\}$ and $[(F, G), I] \in \mathcal{C} \cup \{[(D, E), H]\}$. Then, $[(F, G), I] \in \mathcal{C}$. It follows from definition that $[(F, G), I] \in \mathcal{C} \setminus \sigma_{\downarrow}(\mathcal{C}_{(E-D)})$. Then, $[(F, G), I] \in \mathcal{C}$ and $[(F, G), I] \notin \sigma_{\downarrow}(\mathcal{C}_{(E-D)})$. Thus, by (ii), $[(F, G), I] \notin \mathcal{C} \setminus \mathcal{C} * [(D, E), H]$. Hence, $[(F, G), I] \in \mathcal{C} * [(D, E), H]$. \square

• *Construction to postulates.* Let $\otimes_{\sigma_{\downarrow}}$ be a prioritized \mathcal{C} -revision using reliability for \mathcal{C} . We need to show that it satisfies the five conditions of the theorem.

(PR1) *Success:* $[T, D] \in \mathcal{C} \otimes_{\sigma_{\downarrow}} [T, D]$.

Proof. Straightforward by definition.

(PR2) *Inclusion:* $\mathcal{C} \otimes_{\sigma_{\downarrow}} [T, D] \subseteq \mathcal{C} \cup \{[T, D]\}$.

Proof. Straightforward by definition.

(PR3) *Soundness:* if \mathcal{C} is sound then $\mathcal{C} \otimes_{\sigma_{\downarrow}} [T, D]$ is sound.

Proof. Straightforward by definition.

(PR4) *Uniformity:* $\mathcal{C} \cap (\mathcal{C} \otimes_{\sigma_{\downarrow}} [T, D]) = \mathcal{C} \cap (\mathcal{C} \otimes_{\sigma_{\downarrow}} [T, E])$.

Proof. Suppose to the contrary that $\mathcal{C} \cap (\mathcal{C} \otimes_{\sigma_{\downarrow}} [(F, G), D]) \neq \mathcal{C} \cap (\mathcal{C} \otimes_{\sigma_{\downarrow}} [(F, G), E])$. Then, suppose that $[(H, I), J] \in \mathcal{C} \cap (\mathcal{C} \otimes_{\sigma_{\downarrow}} [(F, G), D])$. Thus, $[(H, I), J] \in \mathcal{C}$ and $[(H, I), J] \in \mathcal{C} \otimes_{\sigma_{\downarrow}} [(F, G), D]$. Following Definition 14, $[(H, I), J] \in (\mathcal{C} \ominus_{\sigma_{\downarrow}} (G, F)) \oplus [(F, G), D]$. Then, by Definition 9, $[(H, I), J] \in \mathcal{C} \ominus_{\sigma_{\downarrow}} (G, F)$. Thus, $[(H, I), J] \in (\mathcal{C} \ominus_{\sigma_{\downarrow}} (G, F)) \cup [(F, G), E]$, and by Definition 9, $[(H, I), J] \in (\mathcal{C} \ominus_{\sigma_{\downarrow}} (G, F)) \oplus [(F, G), E]$. Then, by Definition 14, $[(H, I), J] \in \mathcal{C} \otimes_{\sigma_{\downarrow}} [(F, G), E]$, contrary to $[(H, I), J] \in \mathcal{C} \cap (\mathcal{C} \otimes_{\sigma_{\downarrow}} [(F, G), D])$ with $\mathcal{C} \cap (\mathcal{C} \otimes_{\sigma_{\downarrow}} [(F, G), D]) \neq \mathcal{C} \cap (\mathcal{C} \otimes_{\sigma_{\downarrow}} [(F, G), E])$.

(PR5) *Safe retainment:* $[(D, E), F] \in \mathcal{C} \otimes_{\sigma_{\downarrow}} [(G, H), I]$ if and only if $[(D, E), F]$ is a safe element with respect to (H, G) in \mathcal{C} .

Proof.

(\Rightarrow) Suppose that $[(D, E), F] \in \mathcal{C} \otimes_{\sigma_{\downarrow}} [(G, H), I]$.

Following Definition 14, $[(D, E), F] \in (\mathcal{C} \ominus_{\sigma_{\downarrow}} (H, G)) \oplus [(G, H), I]$. Thus, by Definition 9, $[(D, E), F] \in \mathcal{C} \ominus_{\sigma_{\downarrow}} (H, G)$. Then, following Definition 13, $[(D, E), F] \in \mathcal{C} \setminus \sigma_{\downarrow} (\mathcal{C}_{(H-G)})$ and $[(D, E), F] \notin \sigma_{\downarrow} (\mathcal{C}_{(H-G)})$. Then, by Definition 12, for every path P from H to G if $[(D, E), F] \in P$ then $\exists [(I, J), K] \in P$ with $(K, F) \in Cl(\mathcal{C})$. Thus, $[(D, E), F]$ is a safe element with respect to (H, G) in \mathcal{C} .

(\Leftarrow) Suppose that $[(D, E), F]$ is a safe element with respect to (H, G) in \mathcal{C} . Then, for every path $P \in \mathcal{C}_{(H-G)}$ either $[(D, E), F] \notin P$, or $\exists [(I, J), K] \in P$ with $(K, F) \in Cl(\mathcal{C})$. Thus, following Definition 12, $[(D, E), F] \notin \sigma_{\downarrow} (\mathcal{C}_{(H-G)})$. Then, $[(D, E), F] \in \mathcal{C} \setminus \sigma_{\downarrow} (\mathcal{C}_{(H-G)})$ and by Definition 13 $[(D, E), F] \in \mathcal{C} \ominus_{\sigma_{\downarrow}} (H, G)$. Following Definition 9, $[(D, E), F] \in (\mathcal{C} \ominus_{\sigma_{\downarrow}} (H, G)) \oplus [(G, H), I]$. Hence, by Definition 14, $[(D, E), F] \in \mathcal{C} \otimes_{\sigma_{\downarrow}} [(G, H), I]$. \square

Proposition 4. If “ \oplus ” satisfies E1, E2, E3, E4, E5 and E6, and “ $\ominus_{\sigma_{\downarrow}}$ ” satisfies C1, C2 and C3, then “ $\otimes_{\sigma_{\downarrow}}$ ” satisfies PR1, PR2, PR3, PR4, and PR5.

Proof. Let “ $\otimes_{\sigma_{\downarrow}}$ ” be a prioritized C-revision using reliability for \mathcal{C} , defined as $\mathcal{C} \otimes_{\sigma_{\downarrow}} [(D, E), H] = (\mathcal{C} \ominus_{\sigma_{\downarrow}} (E, D)) \oplus [(D, E), H]$. We need to show that it satisfies PR1, ..., PR5 from the postulates of C-expansion using reliability and from the postulates of C-contraction using reliability.

(PR1) *Success:* $[T, D] \in \mathcal{C} \otimes_{\sigma_{\downarrow}} [T, D]$.

Proof. Let $T = (E, F)$. By Definition 14, $\mathcal{C} \otimes_{\sigma_{\downarrow}} [(E, F), D] = (\mathcal{C} \ominus_{\sigma_{\downarrow}} (F, E)) \oplus [(E, F), D]$. Then, following C1, $(F, E) \notin Cl(\mathcal{C} \ominus_{\sigma_{\downarrow}} (F, E))$. Hence, by E2, $[(E, F), D] \in (\mathcal{C} \ominus_{\sigma_{\downarrow}} (F, E)) \oplus [(E, F), D]$. Therefore, $[T, D] \in \mathcal{C} \otimes_{\sigma_{\downarrow}} [T, D]$.

(PR2) *Inclusion:* $\mathcal{C} \otimes_{\sigma_{\downarrow}} [T, H] \subseteq \mathcal{C} \cup \{[T, H]\}$.

Proof. Let $T = (D, E)$. It follows from C2 that $\mathcal{C} \ominus_{\sigma_{\downarrow}} (E, D) \subseteq \mathcal{C}$. Then, $(\mathcal{C} \ominus_{\sigma_{\downarrow}} (E, D)) \cup \{[(D, E), H]\} \subseteq \mathcal{C} \cup \{[(D, E), H]\}$. Thus, by C1 and Definition 9 $(\mathcal{C} \ominus_{\sigma_{\downarrow}} (E, D)) \oplus [(D, E), H] \subseteq \mathcal{C} \cup \{[(D, E), H]\}$. Hence, by Definition 14, $\mathcal{C} \otimes_{\sigma_{\downarrow}} [(D, E), H] \subseteq \mathcal{C} \cup \{[(D, E), H]\}$.

(PR3) *Soundness:* if \mathcal{C} is sound then $\mathcal{C} \otimes_{\sigma_{\downarrow}} [(D, E), H]$ is sound.

Proof. By Definition 14, $\mathcal{C} \otimes_{\sigma_{\downarrow}} [(D, E), H] = (\mathcal{C} \ominus_{\sigma_{\downarrow}} (E, D)) \oplus [(D, E), H]$. From E5, C1, C2 and Proposition 2 it follows that $\mathcal{C} \otimes_{\sigma_{\downarrow}} [(D, E), H]$ is sound.

(PR4) *Uniformity:* $\mathcal{C} \cap (\mathcal{C} \otimes_{\sigma_{\downarrow}} [T, D]) = \mathcal{C} \cap (\mathcal{C} \otimes_{\sigma_{\downarrow}} [T, E])$.

Proof. Suppose to the contrary that $\mathcal{C} \cap (\mathcal{C} \otimes_{\sigma_{\downarrow}} [(F, G), D]) \neq \mathcal{C} \cap (\mathcal{C} \otimes_{\sigma_{\downarrow}} [(F, G), E])$. Then, suppose that $[(H, I), J] \in \mathcal{C} \cap (\mathcal{C} \otimes_{\sigma_{\downarrow}} [(F, G), D])$. Thus, $[(H, I), J] \in \mathcal{C}$ and $[(H, I), J] \in \mathcal{C} \otimes_{\sigma_{\downarrow}} [(F, G), D]$. Following Definition 14, $[(H, I), J] \in (\mathcal{C} \ominus_{\sigma_{\downarrow}} (G, F)) \oplus [(F, G), D]$. Then, by E3 and E6, $[(H, I), J] \in \mathcal{C} \ominus_{\sigma_{\downarrow}} (G, F)$. Thus, $[(H, I), J] \in (\mathcal{C} \ominus_{\sigma_{\downarrow}} (G, F)) \cup [(F, G), E]$, and by C1 and E2, $[(H, I), J] \in (\mathcal{C} \ominus_{\sigma_{\downarrow}} (G, F)) \oplus [(F, G), E]$. Then, by Definition 14, $[(H, I), J] \in \mathcal{C} \otimes_{\sigma_{\downarrow}} [(F, G), E]$, contrary to $[(H, I), J] \in \mathcal{C} \cap (\mathcal{C} \otimes_{\sigma_{\downarrow}} [(F, G), D])$ with $\mathcal{C} \cap (\mathcal{C} \otimes_{\sigma_{\downarrow}} [(F, G), D]) \neq \mathcal{C} \cap (\mathcal{C} \otimes_{\sigma_{\downarrow}} [(F, G), E])$.

(PR5) *Safe retainment:* $[(D, E), F] \in \mathcal{C} \otimes_{\sigma_{\downarrow}} [(G, H), I]$ if and only if $[(D, E), F]$ is a safe element with respect to (H, G) in \mathcal{C} .

Proof.

(\Rightarrow) Suppose that $[(D, E), F] \notin [(G, H), I]$ and $[(D, E), F] \in \mathcal{C} \otimes_{\sigma_{\downarrow}} [(G, H), I]$. Following Definition 14, $[(D, E), F] \in (\mathcal{C} \ominus_{\sigma_{\downarrow}} (H, G)) \oplus [(G, H), I]$. Then, by E3 and E6, $[(D, E), F] \in \mathcal{C} \ominus_{\sigma_{\downarrow}} (H, G)$. Thus, by C3, $[(D, E), F]$ is a safe element with respect to (H, G) in \mathcal{C} .

(\Leftarrow) $[(D, E), F]$ is a safe element with respect to (H, G) in \mathcal{C} . Then, by C3, $[(D, E), F] \in \mathcal{C} \ominus_{\sigma_{\downarrow}} (H, G)$. Thus, by E3, $[(D, E), F] \in (\mathcal{C} \ominus_{\sigma_{\downarrow}} (H, G)) \oplus [(G, H), I]$. Hence, following Definition 14, $[(D, E), F] \in \mathcal{C} \otimes_{\sigma_{\downarrow}} [(G, H), I]$. \square

Proposition 5. Given $\mathcal{C} \in \mathbb{C}$, if “ $\otimes_{\sigma_{\downarrow}}$ ” is a non-prioritized revision using reliability for \mathcal{C} then “ $\otimes_{\sigma_{\downarrow}}$ ” satisfies relative success (NPR1), weak success (NPR2), conditional success (NPR3), inclusion (NPR4), soundness (NPR5), uniformity (NPR6), and safe retainment (NPR7).

Proof. Let $\odot_{\sigma_{\downarrow}}$ be a non-prioritized revision using reliability for \mathcal{C} . We need to show that it satisfies the seven conditions of the proposition.

(NPR1) *Relative success:* $\mathcal{C} \odot_{\sigma_{\downarrow}} [T, S] = \mathcal{C}$ or $[T, S] \in \mathcal{C} \odot_{\sigma_{\downarrow}} [T, S]$.

Proof. Straightforward by definition.

(NPR2) *Weak success:* if $(B, A) \notin Cl(\mathcal{C})$ then $[(A, B), S] \in \mathcal{C} \odot_{\sigma_{\downarrow}} [(A, B), S]$.

Proof. Straightforward by definition.

(NPR3) *Conditional success:* $[(A, B), S] \in \mathcal{C} \odot_{\sigma_{\downarrow}} [(A, B), S]$ when for all objects $[(D, E), F]$ that are no safe with respect to (B, A) in \mathcal{C} it holds that $(F, S) \in Cl(\mathcal{C})$.

Proof. Let $[(A, B), S]$ be a credibility object and suppose that for all objects $[(D, E), F]$ that are not safe with respect to (B, A) in \mathcal{C} it holds that $(F, S) \in Cl(\mathcal{C})$. Then, for every path $P \in \mathcal{C}_{(B-A)}$ with $[(D, E), F] \in P$, it does not hold that there is $[(I, J), K] \in P$ with $(K, F) \in Cl(\mathcal{C})$; thus, by Definition 11 $[(D, E), F] \in \min_{\mathcal{C}}(P)$. Then, for all objects $[T, Y] \in \bigcup_{P \in \mathcal{C}_{(B-A)}} \min_{\mathcal{C}}(P)$ it holds that $(Y, S) \in Cl(\mathcal{C})$; thus, following Definitions 15, 16, and 17, for all $X \in Rl((B, A), \mathcal{C})$, $(X, S) \in Cl(\mathcal{C})$. Then, by Definition 18, $\mathcal{C} \odot_{\sigma_{\downarrow}} [(A, B), S] = \mathcal{C} \otimes_{\sigma_{\downarrow}} [(A, B), S]$. Hence, by Definition 14, $[(A, B), S] \in \mathcal{C} \odot_{\sigma_{\downarrow}} [(A, B), S]$.

(NPR4) *Inclusion:* $\mathcal{C} \odot_{\sigma_{\downarrow}} [T, D] \subseteq \mathcal{C} \cup \{[T, D]\}$.

Proof. Straightforward by definition.

(NPR5) *Soundness:* if \mathcal{C} is sound then $\mathcal{C} \odot_{\sigma_{\downarrow}} [T, D]$ is sound.

Proof. Straightforward by definition.

(NPR6) *Uniformity:* If it holds that $[T, D] \in \mathcal{C} \odot_{\sigma_{\downarrow}} [T, D]$ if and only if $[T, E] \in \mathcal{C} \odot_{\sigma_{\downarrow}} [T, E]$, then $\mathcal{C} \cap (\mathcal{C} \odot_{\sigma_{\downarrow}} [T, D]) = \mathcal{C} \cap (\mathcal{C} \odot_{\sigma_{\downarrow}} [T, E])$.

Proof. Suppose to the contrary that $[(F, G), D] \in \mathcal{C} \odot_{\sigma_{\downarrow}} [(F, G), D]$ iff $[(F, G), E] \in \mathcal{C} \odot_{\sigma_{\downarrow}} [(F, G), E]$ and suppose that $\mathcal{C} \cap (\mathcal{C} \odot_{\sigma_{\downarrow}} [(F, G), D]) \neq \mathcal{C} \cap (\mathcal{C} \odot_{\sigma_{\downarrow}} [(F, G), E])$. Then, suppose that $[(H, I), J] \in \mathcal{C} \cap (\mathcal{C} \odot_{\sigma_{\downarrow}} [(F, G), D])$. Thus, $[(H, I), J] \in \mathcal{C}$ and $[(H, I), J] \in \mathcal{C} \odot_{\sigma_{\downarrow}} [(F, G), D]$. Since $[(H, I), J] \in \mathcal{C} \odot_{\sigma_{\downarrow}} [(F, G), D]$, by Definition 18, $[(H, I), J] \in \mathcal{C} \otimes_{\sigma_{\downarrow}} [(F, G), D]$. Following Definition 14, $[(H, I), J] \in (\mathcal{C} \ominus_{\sigma_{\downarrow}} (G, F)) \oplus [(F, G), D]$. Then, by Definition 9, $[(H, I), J] \in \mathcal{C} \ominus_{\sigma_{\downarrow}} (G, F)$. Thus, $[(H, I), J] \in (\mathcal{C} \ominus_{\sigma_{\downarrow}} (G, F)) \cup [(F, G), E]$, and by Definition 9, $[(H, I), J] \in (\mathcal{C} \ominus_{\sigma_{\downarrow}} (G, F)) \oplus [(F, G), E]$. By Definition 14, $[(H, I), J] \in \mathcal{C} \otimes_{\sigma_{\downarrow}} [(F, G), E]$. Since $[(F, G), E] \in \mathcal{C} \odot_{\sigma_{\downarrow}} [(F, G), E]$, by Definition 18, $[(H, I), J] \in \mathcal{C} \otimes_{\sigma_{\downarrow}} [(F, G), E]$ contrary to $[(H, I), J] \in \mathcal{C} \cap (\mathcal{C} \otimes_{\sigma_{\downarrow}} [(F, G), D])$ with $\mathcal{C} \cap (\mathcal{C} \otimes_{\sigma_{\downarrow}} [(F, G), D]) \neq \mathcal{C} \cap (\mathcal{C} \otimes_{\sigma_{\downarrow}} [(F, G), E])$.

(NPR7) *Safe retainment:* If $[(G, H), I] \in \mathcal{C} \odot_{\sigma_{\downarrow}} [(G, H), I]$ then $[(D, E), F] \in \mathcal{C} \odot_{\sigma_{\downarrow}} [(G, H), I]$ if and only if $[(D, E), F]$ is a safe element with respect to (H, G) in \mathcal{C} .

Proof. Suppose that $[(G, H), I] \in \mathcal{C} \odot_{\sigma_{\downarrow}} [(G, H), I]$.

(\Rightarrow) Suppose that $[(D, E), F] \in \mathcal{C} \odot_{\sigma_{\downarrow}} [(G, H), I]$. Then, since $[(G, H), I] \in \mathcal{C} \odot_{\sigma_{\downarrow}} [(G, H), I]$, by Definition 18, $[(D, E), F] \in \mathcal{C} \otimes_{\sigma_{\downarrow}} [(G, H), I]$. Then, following Definition 14, $[(D, E), F] \in (\mathcal{C} \ominus_{\sigma_{\downarrow}} (H, G)) \oplus [(G, H), I]$. Thus, by Definition 9, $[(D, E), F] \in \mathcal{C} \ominus_{\sigma_{\downarrow}} (H, G)$. Then, following Definition 13, $[(D, E), F] \in \mathcal{C} \setminus \sigma_{\downarrow} (\mathcal{C}_{(H-G)})$ and $[(D, E), F] \notin \sigma_{\downarrow} (\mathcal{C}_{(H-G)})$. Then, by Definition 12, for every path P from H to G if $[(D, E), F] \in P$ then $\exists [(I, J), K] \in P$ with $(K, F) \in Cl(\mathcal{C})$. Thus, $[(D, E), F]$ is a safe element with respect to (H, G) in \mathcal{C} .

(\Leftarrow) Suppose that $[(D, E), F]$ is a safe element with respect to (H, G) in \mathcal{C} . Then, for every path $P \in \mathcal{C}_{(H-G)}$ either $[(D, E), F] \notin P$, or $\exists [(I, J), K] \in P$ with $(K, F) \in Cl(\mathcal{C})$. Thus, following Definition 12, $[(D, E), F] \notin \sigma_{\downarrow} (\mathcal{C}_{(H-G)})$. Then, $[(D, E), F] \in \mathcal{C} \setminus \sigma_{\downarrow} (\mathcal{C}_{(H-G)})$ and by Definition 13 $[(D, E), F] \in \mathcal{C} \ominus_{\sigma_{\downarrow}} (H, G)$. Following Definition 9, $[(D, E), F] \in (\mathcal{C} \ominus_{\sigma_{\downarrow}} (H, G)) \oplus [(G, H), I]$. Hence, by Definition 14, $[(D, E), F] \in \mathcal{C} \otimes_{\sigma_{\downarrow}} [(G, H), I]$. Since $[(G, H), I] \in \mathcal{C} \odot_{\sigma_{\downarrow}} [(G, H), I]$, by Definition 18, $[(D, E), F] \in \mathcal{C} \odot_{\sigma_{\downarrow}} [(G, H), I]$. \square

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