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# Abstract Argumentation with Conditional Preferences

Michael BERNREITER<sup>1</sup>, Wolfgang DVOŘÁK and Stefan WOLTRAN Institute of Logic and Computation, TU Wien, Austria

**Abstract.** In this paper, we study conditional preferences in abstract argumentation by introducing a new generalization of Dung-style argumentation frameworks (AFs) called Conditional Preference-based AFs (CPAFs). Each subset of arguments in a CPAF can be associated with its own preference relation. This generalizes existing approaches for preference-handling in abstract argumentation, and allows us to reason about conditional preferences in a general way. We conduct a principlebased analysis of CPAFs and compare them to related generalizations of AFs. Specifically, we highlight similarities and differences to Modgil's Extended AFs and show that our formalism can capture Value-based AFs.

Keywords. Abstract argumentation, conditional preferences, principles.

## 1. Introduction

Preferences in argumentation have been studied from various points of view, be it in terms of argument strength [1,2,3,4,5] or preferences between values [6,7]. Despite this, *conditional preferences* have received only limited attention in the field of argumentation. Dung et al. investigated conditional preferences in the setting of structured argumentation [8]. There, argumentation frameworks (AFs) are built from defeasible knowledge bases containing preference rules of the form  $a_1, \ldots, a_n \rightarrow d_0 \succ d_1$ , where  $d_0$  and  $d_1$  are defeasible rules. However, no work that deals with conditional preferences on the abstract level is known to us. This is in contrast to unconditional preferences, which are studied both in structured [9,10,11] and abstract [5,7] argumentation in the literature.

Conditional preferences can appear in many situations and formalisms. Dung et al. [8] demonstrate this with the help of an example, which we now  $adapt:^2$ 

**Example 1.** Sherlock Holmes is investigating a murder. There are two suspects, Person 1 and Person 2. After analyzing the crime scene, Sherlock is sure:

• *I*<sub>1</sub>: *Person 1 or Person 2 is the culprit, but not both.* 

Moreover, Sherlock adheres to the following rules:

•  $R_1$ : If Person *i* has a motive but Person *j*, with  $j \neq i$ , does not, then this supports the case that Person *i* is the culprit.

<sup>&</sup>lt;sup>1</sup>Corresponding Author: Michael Bernreiter; E-mail: michael.bernreiter@tuwien.ac.at.

 $<sup>^{2}</sup>$ We specify the example in natural language. See [8] for how Dung's original example can be modeled as a defeasible knowledge base with conditional preferences. Our example can be formalized similarly.

- $R_2$ : If Person i has an alibi but Person j, with  $j \neq i$ , does not, then this supports the case that Person j is the culprit.
- *R*<sub>3</sub>: Alibis have more importance than motives.

After interrogating the suspects, Sherlock concludes that:

- C<sub>1</sub>: Person 1 has a motive but Person 2 does not.
- C<sub>2</sub>: Person 1 has an alibi but Person 2 does not.

If  $C_1$  is trusted, but  $C_2$  is not, then this supports that Person 1 is the culprit. If  $C_2$  is trusted then this supports that Person 2 is the culprit, regardless of our stance on  $C_1$ .

This example demonstrates the importance of conditional preferences in common reasoning tasks. We believe it is valuable to capture conditional preferences in argumentation not only on the structured level as Dung et al. [8] did, but also on the abstract level. Doing so will generalize existing formalisms for unconditional preferences in abstract argumentation and provide a more direct target formalism for structured approaches.

To this end, we introduce Conditional Preference-based AFs (CPAFs), where each subset of arguments *S* can be associated with its own preference relation  $\succ_S$ . Preferences are then resolved via so-called preference-reductions [5], which modify the attack relation based on the given preferences. As a consequence, *S* must be justified in view of its own preferences, i.e., *S* must be an extension in view of  $\succ_S$ .

We show that CPAFs generalize Preference-based AFs (PAFs), and demonstrate that they are capable of dealing with conditional preferences in a general manner. Moreover, we conduct a principle-based analysis of CPAF-semantics and show that especially complete and stable semantics preserve desirable properties of regular PAFs. Lastly, we compare CPAFs to related formalisms. Specifically, we show that CPAFs can capture other generalizations of AFs such as Value-based AFs (VAFs) [6,7] in a straightforward way, and compare CPAFs to Extended Argumentation Frameworks (EAFs) [12,13,14] in order to highlight similarities and differences.

## 2. Preliminaries

We first define (abstract) argumentation frameworks [15].

**Definition 1.** An argumentation framework (AF) is a tuple F = (A, R) where A is a finite set of arguments and  $R \subseteq A \times A$  is an attack relation between arguments. Let  $S \subseteq A$ . We say S attacks b (in F) if  $(a,b) \in R$  for some  $a \in S$ ;  $S_F^+ = \{b \in A \mid \exists a \in S : (a,b) \in R\}$ denotes the set of arguments attacked by S. An argument  $a \in A$  is defended (in F) by S if  $b \in S_F^+$  for each b with  $(b,a) \in R$ .

Semantics for AFs are defined as functions  $\sigma$  which assign to each AF F = (A, R)a set  $\sigma(F) \subseteq 2^A$  of extensions [16]. We consider for  $\sigma$  the functions *cf* (conflict-free), *adm* (admissible), *com* (complete), *stb* (stable), *grd* (grounded), and *prf* (preferred).

**Definition 2.** Let F = (A, R) be an AF. A set  $S \subseteq A$  is conflict-free (in F), written as  $S \in cf(F)$ , if there are no  $a, b \in S$ , such that  $(a, b) \in R$ . For  $S \in cf(F)$  it holds that

- $S \in adm(F)$  if each  $a \in S$  is defended by S in F;
- $S \in com(F)$  if  $S \in adm(F)$  and each  $a \in A$  defended by S in F is contained in S;

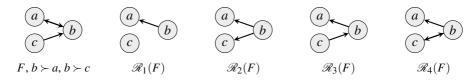


Figure 1. PAF F and its preference reducts from Example 2.

- $S \in stb(F)$  if each  $a \in A \setminus S$  is attacked by S in F;
- $S \in grd(F)$  if  $S \in com(F)$  and there is no  $T \in com(F)$  with  $T \subset S$ ;
- $S \in prf(F)$  if  $S \in adm(F)$  and there is no  $T \in adm(F)$  with  $S \subset T$ ;

Preference-based AFs enrich regular AFs with preferences between arguments.

**Definition 3.** A preference-based AF (PAF) is a triple  $F = (A, R, \succ)$  where (A, R) is an AF and  $\succ$  is an irreflexive and asymmetric binary relation over A.

If *a* and *b* are arguments and  $a \succ b$  holds then we say that *a* is stronger than *b*. An established method of resolving preferences in PAFs are so-called preference reductions, of which there exist four in the literature [5]. If in a PAF  $(A, R, \succ)$  there is an attack  $(a, b) \in R$  and a preference  $b \succ a$  then (a, b) is called a critical attack. In other words, critical attacks are from weak to strong arguments. The preference-reductions resolve preferences by dealing with these critical attacks, e.g., by removing or reverting them.

**Definition 4.** Given a PAF  $F = (A, R, \succ)$ , a corresponding AF  $\mathscr{R}_i(F) = (A, R')$  is constructed via Reduction *i*, where  $i \in \{1, 2, 3, 4\}$ , as follows:

- i = 1:  $\forall a, b \in A$ :  $(a, b) \in R' \Leftrightarrow (a, b) \in R, b \not\succ a$
- $i = 2: \forall a, b \in A: (a, b) \in R' \Leftrightarrow ((a, b) \in R, b \not\succeq a) \text{ or } ((b, a) \in R, (a, b) \notin R, a \succ b)$
- i = 3:  $\forall a, b \in A$ :  $(a, b) \in R' \Leftrightarrow ((a, b) \in R, b \not\succ a) \text{ or } ((a, b) \in R, (b, a) \notin R)$
- i = 4:  $\forall a, b \in A$ :  $(a, b) \in R' \Leftrightarrow ((a, b) \in R, b \neq a) \text{ or } ((b, a) \in R, (a, b) \notin R, a \succ b) \text{ or } ((a, b) \in R, (b, a) \notin R)$

The preference-based variant of a semantics  $\sigma$  relative to Reduction *i* is defined as  $\sigma_p^i(F) = \sigma(\mathscr{R}_i(F))$ .

Intuitively, Reduction 1 removes critical attacks while Reduction 2 reverts them. Reduction 3 removes critical attacks, but only if the stronger argument also attacks the weaker one. Reduction 4 can be seen as a combination of Reduction 2 and 3. Note that on symmetric attacks, all four reductions function in the same way. The following example demonstrates the reductions and PAF-semantics.

**Example 2.** Consider the PAF  $F = (\{a, b, c\}, \{(a, b), (b, a), (c, b)\}, \succ)$  with  $b \succ a$  and  $b \succ c$ . Figure 1 depicts F as well as  $\mathscr{R}_i(F)$ ,  $i \in \{1, 2, 3, 4\}$ . It can be checked that, for Reduction 1,  $adm_p^1(F) = adm(\mathscr{R}_i(F)) = \{\emptyset, \{b\}, \{c\}, \{b, c\}\}$  and therefore  $com_p^1(F) = prf_p^1(F) = stb_p^1(F) = \{\{b, c\}\}$ . If we use Reduction 2 for example we get different extensions, namely  $adm_p^2(F) = \{\emptyset, \{b\}\}$  and  $com_p^2(F) = prf_p^2(F) = stb_p^2(F) = \{\{b\}\}$ .

A principle-based analysis of the four preference reductions was conducted for complete, grounded, preferred, and stable semantics [4,5]. To this end, the following six PAF-properties were laid out and investigated.

	$\mathscr{R}_1$	$\mathscr{R}_2$	$\mathscr{R}_3$	$\mathscr{R}_4$
<i>P</i> 1	×	CGPS	CGPS	CGPS
P2	×	×	CS	×
Р3	×	×	CS	×
<i>P</i> 4	×	×	CGS	×
<i>P</i> 5	×	×	CG	×
<i>P</i> 6	G	G	CGPS	G

**Table 1.** Satisfaction of various PAF-principles. C stands for complete, G for grounded, P for preferred, and S for stable.  $\times$  indicates that none of those four semantics satisfy this principle.

# **Definition 5.** Let $\sigma_p^i$ be a PAF-semantics. Let $\succ' \subseteq (A \times A)$ be irreflexive and asymmetric.

- $\sigma_p^i$  satisfies P1 (conflict-freeness) iff for all PAFs  $F = (A, R, \succ)$  there is no  $S \in \sigma_p^i(F)$  such that  $\{a, b\} \subseteq S$  and  $(a, b) \in R$ .
- $\sigma_p^i$  satisfies P2 (preference selects extensions 1) iff  $\sigma_p^i(A, R, \succ \cup \succ') \subseteq \sigma_p^i(A, R, \succ)$ holds for all PAFs  $(A, R, \succ)$  and all  $\succ'$ .
- $\sigma_p^i$  satisfies P3 (preference selects extensions 2) iff  $\sigma_p^i(A, R, \succ) \subseteq \sigma_p^i(A, R, \emptyset)$  holds for all PAFs  $(A, R, \succ)$ .
- $\sigma_p^i$  satisfies P4 (extension refinement) iff for all  $S' \in \sigma_p^i(A, R, \succ \cup \succ')$  there exists some  $S \in \sigma_p^i(A, R, \succ)$  such that  $S \subseteq S'$ .
- $\sigma_p^i$  satisfies P5 (extension growth) iff  $\bigcap(\sigma_p^i(A, R, \succ)) \subseteq \bigcap(\sigma_p^i(A, R, \succ \cup \succ'))$  holds for all PAFs  $(A, R, \succ)$  and all  $\succ'$ .
- $\sigma_p^i$  satisfies P6 (number of extensions) iff  $|\sigma_p^i(A, R, \succ \cup \succ')| \le |\sigma_p^i(A, R, \succ)|$  holds for all PAFs  $(A, R, \succ)$  and all  $\succ'$ .

Intuitively, *P*1 states that if there is an attack between two arguments, then there is no extension containing both of them. *P*2 expresses that adding more preferences to a PAF can exclude extensions, but not introduce them. *P*3 is a special case of *P*2. *P*4 states that adding preferences means extensions will be supersets of extensions in the original PAF. *P*5 says that adding preferences will preserve skeptically accepted arguments, and might cause new arguments to be skeptically accepted. *P*6 expresses that the number of extensions will not grow if new preferences are added.

Table 1 shows which semantics satisfy which principle. In addition to these fundamental principles [4], four more principles were introduced later [5], but we do not consider them at this point and leave them for future work.

#### 3. Conditional Preference-Based Argumentation Frameworks

As argued in the introduction, our aim is to provide a framework for reasoning about conditional preferences in abstract argumentation. This means that arguments themselves must be capable of expressing preferences, and that those argument-bound preferences are relevant only if the corresponding arguments are themselves accepted. How this is implemented must be considered carefully, as Example 1 demonstrates. There, the fact that Person 1 has a motive (let us refer to this as  $m_1$ ) and the fact that Person 1 has an alibi  $(a_1)$  result in opposing preferences. When accepting both  $m_1$  and  $a_1$  it seems natural to combine these opposing preferences, i.e., to cancel them. But this does not allow us to express that alibis are more important than motives, as required in Example 1. Therefore,

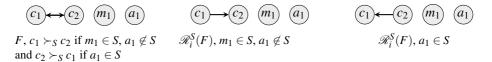


Figure 2. CPAF F and its preference-reducts from Example 3.

we need to define our formalism in a general way such that the joint acceptance of arguments must not necessarily result in the combination of their associated preferences. We solve this by mapping each subset *S* of arguments to a separate preference relation  $\succ_S$ .

**Definition 6.** A Conditional PAF (CPAF) is a triple F = (A, R, cond), where (A, R) is an AF and cond:  $2^A \rightarrow 2^{(A \times A)}$  is a function that maps each set of arguments  $S \subseteq A$  to an irreflexive and asymmetric binary relation  $\succ_S$  over A.

Note that we set no restriction on how exactly conditional preferences are represented. This is deliberate, as we wish to stay as general as possible. In practice, succinct representations could be achieved, e.g., by expressing the *cond*-function via rules of the form  $F \rightarrow x \succ y$  where F is a propositional formula over the arguments.

Just as in regular PAFs, preferences in CPAFs are resolved with the help of the four preference-reductions (cf. Definition 4). A set of arguments *S* is an extension of some CPAF if it is an extension relative to its associated preference relation cond(S).

**Definition 7.** Let F = (A, R, cond) be a CPAF and let  $S \subseteq A$ . The S-reduct of F with respect to a preference reduction  $i \in \{1, 2, 3, 4\}$  is defined as  $\mathscr{R}_i^S(F) = \mathscr{R}_i(A, R, cond(S))$ . Given an AF semantics  $\sigma$ ,  $S \in \sigma_{cp}^i(F)$  iff  $S \in \sigma(\mathscr{R}_i^S(F))$ .

Using CPAFs we can easily formalize our Sherlock Holmes example.

**Example 3.** We continue Example 1 and introduce two arguments  $c_1$  and  $c_2$  expressing that Person 1 (resp. Person 2) is the culprit. Moreover, we introduce  $m_1$  and  $a_1$  to express that Person 1 has a motive (resp. alibi) but Person 2 does not.  $c_1$  and  $c_2$  attack each other while  $m_1$  and  $a_1$  have no incoming or outgoing attacks, but rather express preferences. Formally, we model this via the CPAF  $F = (\{c_1, c_2, m_1, a_1\}, \{(c_1, c_2), (c_2, c_1)\}, cond)$  with cond such that  $c_1 \succ_S c_2$  if  $m_1 \in S$  but  $a_1 \notin S$ ,  $c_2 \succ_S c_1$  if  $a_1 \in S$ , and  $cond(S) = \emptyset$  for all other  $S \subseteq A$ . Figure 2 depicts F and the S-reducts of F. Note that  $m_1$  and  $a_1$  are unattacked in all S-reducts of F. Therefore, both arguments must be part of any  $\sigma_{cp}^i$ -extension for  $\sigma \in \{grd, com, prf, stb\}$  and we can conclude that  $\sigma_{cp}^i(F) = \{\{m_1, a_1, c_2\}\}$ .

Note that the preferred semantics defined above do not maximize over all admissible sets of a CPAF, but rather over all admissible sets in the given S-reduct. This means that if there is a set S that is admissible in the S-reduct of F, but there is also some  $T \supset S$  that is admissible in the S-reduct of F, then S is not preferred in F. But this T does not have to be admissible in F, since it might not be admissible in the T-reduct of F. Thus, the following alternative semantics may be considered more natural:

**Definition 8.** Let F = (A, R, cond) be a CPAF and let  $S \subseteq A$ . Then  $S \in prf - glb_{cp}^{i}(F)$  iff  $S \in adm_{cp}^{i}(F)$  and there is no T such that  $S \subset T$  and  $T \in adm_{cp}^{i}(F)$ .

Intuitively, prf- $glb_{cp}^{i}$  maximizes globally over all admissible sets of a CPAF, while  $prf_{cp}^{i}$  maximizes locally over the admissible sets of the given S-reduct.

**Example 4.** Let *F* be the CPAF from Example 3 and recall that  $prf_{cp}^i(F) = \{\{m_1, a_1, c_2\}\}$ . Observe that  $\{m_1, c_1\}$  is not preferred in the  $\{m_1, c_1\}$ -reduct of *F*, but it is a subsetmaximal admissible set in *F*. Thus, prf- $glb_{cp}^i(F) = \{\{m_1, a_1, c_2\}, \{m_1, c_1\}\}$ .

The difference between the two variants is not only philosophical, but impacts fundamental properties for maximization-based semantics such as I-maximality. A semantics  $\sigma_{cp}^i$  is I-maximal if, for all CPAFs *F* and all  $S, T \in \sigma_{cp}^i(F), S \subseteq T$  implies S = T.

**Proposition 1.** prf- $glb_{cp}^{i}$  is *I*-maximal, but  $prf_{cp}^{i}$  is not, where  $i \in \{1, 2, 3, 4\}$ .

*Proof.* I-maximality of prf- $glb_{cp}^{i}$  follows from Definition 8. For our counter examples we consider the preference-reductions separately. Reduction 1: consider the CPAF  $F = (\{a,b\},\{(a,b)\},cond\}$  with *cond* such that  $b \succ_{\{a,b\}} a$ . Then  $\{a\} \in prf_{cp}^{1}(F)$  and  $\{a,b\} \in prf_{cp}^{1}(F)$ . Reductions 2 and 4: consider the CPAF  $F' = (\{a,b,c\},\{(a,b),(b,c),(c,a)\}, cond\}$  with *cond* such that  $a \succ_{\{a\}} c$ . Then  $\emptyset \in prf_{cp}^{i}(F')$  and  $\{a\} \in prf_{cp}^{i}(F')$ . Reduction 3: consider the CPAF  $F'' = (\{a,b,c\},\{(a,b),(b,c),(c,a)\}, cond\}$  with *cond* such that  $a \succ_{\{a\}} c$ . Then  $\emptyset \in prf_{cp}^{i}(F')$  and  $\{a\} \in prf_{cp}^{i}(F')$ . Reduction 3: consider the CPAF  $F'' = (\{a,b,c\},\{(a,b),(b,c),(c,a)\}, cond\}$  with *cond* such that  $a \succ_{\emptyset} b$ . Then  $\emptyset \in prf_{cp}^{i}(F')$  and  $\{b\} \in prf_{cp}^{i}(F')$ .

One may be tempted to deduce from the above proposition that prf- $glb_{cp}^{i}$  is more suitable as a default preferred semantics than  $prf_{cp}^{i}$ . However, we will see in Section 5.1 that  $prf_{cp}^{i}$  allows us to capture the problems of subjective/objective acceptance in VAFs in a natural way. In our subsequent analysis of CPAFs we consider both  $prf_{cp}^{i}$  and prf- $glb_{cp}^{i}$ . Like preferred semantics, stable semantics satisfy I-maximality on regular AFs. Interestingly, on CPAFs, this depends on the preference-reduction.

# **Proposition 2.** $stb_{cp}^{1}$ is not I-maximal, but $stb_{cp}^{j}$ is, where $j \in \{2,3,4\}$ .

*Proof.* For  $stb_{cp}^{1}$  we can use the same counter-example as for  $prf_{cp}^{1}$  (cf. Proposition 1). For  $stb_{cp}^{j}$  with  $j \in \{2,3,4\}$  we proceed by contradiction: assume there is a CPAF F = (A, R, cond) with  $S, T \in stb_{cp}^{j}(F)$  such that  $S \subset T$ . Then there is  $x \in T$  such that  $x \notin S$ . Since  $S \in stb_{cp}^{j}(F)$  there is  $y \in S$  such that  $(y,x) \in \mathscr{R}_{j}^{S}(F)$ . Reductions 2, 3, and 4 do not remove conflicts between arguments, and thus either  $(y,x) \in R$  or  $(x,y) \in R$ . Therefore,  $(y,x) \in \mathscr{R}_{i}^{T}(F)$  or  $(x,y) \in \mathscr{R}_{i}^{T}(F)$ . But  $y \in S$  implies  $y \in T$ , i.e.,  $T \notin cf_{cp}^{j}(F)$ .

Another interesting point is that grounded extensions are not necessarily unique in CPAFs: consider  $F = (\{a, b\}, \{(a, b)\}, cond)$  with *cond* such that  $b \succ_{\{b\}} a$ . Then  $\{a\} \in grd^2_{cp}(F)$  and  $\{b\} \in grd^2_{cp}(F)$ . We stress that each grounded extension *S* is still unique in the *S*-reduct of the given CPAF and thus unique with respect to its own preferences.

Lastly, by the following proposition we express that all CPAF-semantics considered here generalize their corresponding PAF-semantics, i.e., that CPAFs generalize PAFs.

**Proposition 3.** Let F = (A, R, cond) be a CPAF such that the preference function cond maps every set of arguments to the same binary relation, i.e., there is some  $\succ$  such that  $cond(S) = \succ$  for all  $S \subseteq A$ . Let  $\sigma \in \{cf, adm, stb, com, prf, grd\}$ . Then  $\sigma_{cp}^i(F) = \sigma_p^i(A, R, \succ)$ . Furthermore,  $prf \cdot glb_{cp}^i(F) = prf_p^i(A, R, \succ)$ .

#### 4. Principle-Based Analysis

In this section, we generalize the principles of Kaci et al. for PAFs (cf. Definition 5) to account for conditional preferences. We then investigate by which semantics these principles are satisfied, and show that there are differences to the case of regular PAFs.

**Definition 9.** Let  $\sigma_{cp}^i$  be a CPAF-semantics. In the following, given a CPAF (A, R, cond), we denote by cond' an arbitrary function such that  $cond(S) \subseteq cond'(S)$  for all  $S \subseteq A$ . Furthermore,  $cond_{\emptyset}(S) = \emptyset$  for all  $S \subseteq A$ .

- $\sigma_{cp}^{i}$  satisfies P1\* (conflict-freeness) iff for all CPAFs F = (A, R, cond) there is no  $S \in \sigma_{cp}^{i}(F)$  such that  $\{a, b\} \subseteq S$  and  $(a, b) \in R$ .
- $\sigma_{cp}^{i}$  satisfies P2\* (preference selects extensions) iff for all CPAFs (A,R,cond) it holds that  $\sigma_{cp}^{i}(A,R,cond') \subseteq \sigma_{cp}^{i}(A,R,cond)$ .
- $\sigma_{cp}^i$  satisfies P3\* (preference selects extensions 2) iff for all CPAFs (A,R,cond) it holds that  $\sigma_{cp}^i(A,R,cond) \subseteq \sigma_{cp}^i(A,R,cond_{\emptyset})$ .
- $\sigma_{cp}^i$  satisfies P4\* (extension refinement) iff for all  $S' \in \sigma_{cp}^i(A, R, cond')$  there exists some  $S \in \sigma_{cp}^i(A, R, cond)$  such that  $S \subseteq S'$ .
- $\sigma_{cp}^i$  satisfies P5<sup>\*</sup> (extension growth) iff for all CPAFs (A,R,cond) it holds that  $\bigcap(\sigma_{cp}^i(A,R,cond)) \subseteq \bigcap(\sigma_{cp}^i(A,R,cond')).$
- $\sigma_{cp}^{i}$  satisfies P6\* (number of extensions) iff for all CPAFs (A, R, cond) it holds that  $|\sigma_{cp}^{i}(A, R, cond')| \leq |\sigma_{cp}^{i}(A, R, cond)|.$

The following lemma establishes some relationships between the CPAF-principles and is a generalization of known relationships between PAF-principles [5].

**Lemma 4.** If  $\sigma_{cp}^i$  satisfies P2<sup>\*</sup> then it also satisfies P3<sup>\*</sup>, P4<sup>\*</sup>, and P6<sup>\*</sup>. If  $\sigma_{cp}^i$  always returns at least one extension, and if it satisfies P2<sup>\*</sup>, then it also satisfies P5<sup>\*</sup>.

Observe that, since CPAFs are a generalization of PAFs (cf. Proposition 3), a CPAFsemantics  $\sigma_{cp}^i$  can not satisfy  $Pj^*$  if the corresponding PAF-semantics  $\sigma_p^i$  does not satisfy Pj. Moreover, it is obvious that  $P1^*$  is still satisfied under Reductions 2, 3, and 4, as conflicts are not removed by these reductions even if we consider conditional preferences. We can also show that satisfaction of P2 carries over from PAFs to CPAFs.

**Lemma 5.** If some  $\sigma_p^i$  satisfies P2 then  $\sigma_{cp}^i$  satisfies P2<sup>\*</sup>.

*Proof.* Assume  $\sigma_{cp}^i$  does not satisfy  $P2^*$ . Then there is a CPAF F = (A, R, cond) and *cond'* with  $cond(S) \subseteq cond'(S)$  for all  $S \subseteq A$  such that  $\sigma_{cp}^i(A, R, cond') \not\subseteq \sigma_{cp}^i(A, R, cond)$ . Thus, there is  $E \subseteq A$  such that  $E \in \sigma_{cp}^i(A, R, cond')$  but  $E \notin \sigma_{cp}^i(A, R, cond)$ . Then  $E \in \sigma(\mathscr{R}_i(A, R, cond'(E)))$  but  $E \notin \sigma(\mathscr{R}_i(A, R, cond(E)))$ , i.e.,  $\sigma_p^i$  does not satisfy P2.

Lemma 5 implies that complete and stable semantics satisfy  $P2^*$  on CPAFs under Reduction 3. By Lemma 4 these semantics also satisfy  $P3^*$ ,  $P4^*$ , and  $P6^*$ . However, we can not use Lemma 4 to show that complete semantics satisfy  $P5^*$ , since conditional preferences allow for frameworks without complete extensions. Indeed, we can find a counter-example in this case. Counter-examples for the satisfaction of various principles can also be found for grounded semantics and both variants of the preferred semantics.

	$\mathscr{R}_1$	$\mathscr{R}_2$	$\mathscr{R}_3$	$\mathscr{R}_4$
$P1^*$	×	CGPS	CGPS	CGPS
$P2^*$	×	×	CS	×
$P3^*$	×	×	CS	×
$P4^*$	×	×	CS	×
$P5^*$	×	×	×	×
$P6^*$	×	×	CS	×

**Table 2.** Satisfaction of CPAF-principles. *C* stands for complete, *G* for grounded, *P* for preferred (local and global maximization), and *S* for stable.  $\times$  indicates that none of those semantics satisfy this principle.

**Lemma 6.**  $com_{cp}^3$  does not satisfy P5<sup>\*</sup>.  $grd_{cp}^i$ , with  $i \in \{1, 2, 3, 4\}$ , does not satisfy any of P4<sup>\*</sup>, P5<sup>\*</sup>, or P6<sup>\*</sup>. Moreover,  $prf_{cp}^3$  and prf- $glb_{cp}^3$  do not satisfy P6<sup>\*</sup>.

*Proof.* For complete semantics, consider  $A = \{a, b\}, R = \{(a, b), (b, a)\}$ , *cond* such that  $a \succ_{\emptyset} b$  and  $a \succ_{\{b\}} b$ , as well as *cond'* such that  $a \succ'_{\emptyset} b$ ,  $a \succ'_{\{b\}} b$ , and  $b \succ'_{\{a\}} a$ . Then  $com^3_{cp}(A, R, cond) = \{\{a\}\}$  while  $com^3_{cp}(A, R, cond') = \emptyset$ .

For grounded semantics, consider  $A = \{a, b\}$ ,  $R = \{(a, b), (b, a)\}$ , cond such that  $a \succ_{\emptyset} b$  and  $a \succ_{\{a\}} b$ , as well as cond' such that  $a \succ'_{\emptyset} b$ ,  $a \succ'_{\{a\}} b$ , and  $b \succ'_{\{b\}} a$ . Then  $grd^{i}_{cp}(A, R, cond) = \{\{a\}\}$  while  $grd^{i}_{cp}(A, R, cond') = \{\{a\}, \{b\}\}$ .

For preferred semantics, consider  $A = \{a, b, c\}$ ,  $R = \{(a, c), (c, a), (b, c), (c, b), (c, c)\}$ , *cond* such that *cond*(S) =  $\emptyset$  for all  $S \subseteq A$ , and *cond'* such that  $c \succ'_{\{b\}} a, c \succ'_{\{a\}} b$ ,  $c \succ'_{\{a,b\}} a$ , and  $c \succ'_{\{a,b\}} b$ . Then  $prf_{cp}^3(A, R, cond) = prf$ - $glb_{cp}^3(A, R, cond) = \{\{a,b\}\}$  while  $prf_{cp}^3(A, R, cond') = prf$ - $glb_{cp}^3(A, R, cond') = \{\{a\}, \{b\}\}$ .

The above results constitute an exhaustive investigation of the six CPAF-principles for all semantics considered in this paper. Thus, we can conclude:

#### **Theorem 7.** The satisfaction of CPAF-principles depicted in Table 2 holds.

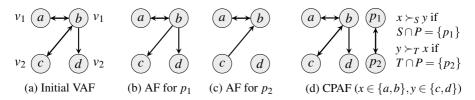
To summarize, complete and stable semantics preserve the satisfaction of PAFprinciples in almost all cases. Grounded semantics no longer satisfy any of the principles on CPAFs except  $P1^*$  (conflict-freeness) since grounded extensions are not unique on CPAFs, and since there are even CPAFs without a grounded extension (cf. Lemma 6). Unlike on PAFs, complete semantics do not satisfy  $P5^*$  (extension growth) under Reduction 3. Furthermore, neither variant of preferred semantics satisfies  $P6^*$  (number of extensions) under Reduction 3.

#### 5. Related Formalisms

We now investigate the connection between CPAFs and two related formalisms. First, we show that Value-based Argumentation Frameworks (VAFs) [6,7] can be captured by CPAFs in a straightforward way. Secondly, we consider Extended Argumentation Frameworks (EAFs) [12,13,14] and highlight similarities and differences to CPAFs.

#### 5.1. Capturing Value-Based Argumentation

VAFs, similarly to CPAFs, are capable of dealing with multiple preference relations. But, in contrast to CPAFs, these preferences are not over individual arguments but over values



**Figure 3.** A VAF with two audiences  $p_1$  ( $v_1 \succ v_2$ ) and  $p_2$  ( $v_2 \succ v_1$ ) translated to a CPAF.

associated with arguments. Which values are preferred depends on the audience. A set of arguments may then be accepted in view of one audience, but not in view of another.

More formally, a VAF is a quintuple (A, R, V, val, P) such that (A, R) is an AF, V is a set of values,  $val: A \rightarrow V$  is a mapping from arguments to values, and P is a finite set of audiences. Each audience  $p \in P$  is associated with a preference relation  $\succ_p$  over values, and  $F_P = (A, R, V, val, \succ_p)$  is called an audience-specific VAF (AVAF). The extensions of VAFs are determined for each audience separately. Specifically, an argument x successfully attacks y in  $F_p$  iff  $(x, y) \in R$  and  $val(y) \neq_p val(x)$ . Conflict-freeness and admissibility are then defined over these successful attacks. In essence, this boils down to using Reduction 1 on  $F_p$ , i.e., deleting attacks that contradict the preference ordering.

For example, Figure 3a shows a VAF with two values  $v_1$  and  $v_2$ . Let us say there are two audiences in this VAF,  $p_1$  with the preference  $v_1 \succ v_2$  and  $p_2$  with  $v_2 \succ v_1$ . The AFs associated with  $p_1$  and  $p_2$ , i.e., the AFs containing only the successful attacks in the AVAFs of  $p_1$  and  $p_2$ , are depicted in Figures 3b and 3c.

The reasoning tasks typically associated with VAFs are those of subjective and objective acceptance. Let F = (A, R, V, val, P) be a VAF and  $x \in A$ . Then x is subjectively accepted in F iff there is  $p \in P$  such that x is in a preferred extension of the AVAF  $(A, R, V, val, \succ_p)$ . Similarly, x is objectively accepted in F iff for all  $p \in P$  we have that x is in all preferred extensions of the AVAF  $(A, R, V, val, \succ_p)$ .

We now provide a translation where an arbitrary VAF F = (A, R, V, val, P) is transformed into a CPAF Tr(F) = (A', R', cond) such that the subjectively and objectively accepted arguments in F correspond to the credulously and skeptically preferred arguments<sup>3</sup> in Tr(F) respectively. Firstly, each audience in the initial VAF becomes an argument in our CPAF, i.e.,  $A' = A \cup P$ . Secondly, the attacks of the VAF are preserved and symmetric attacks are added between all audience-arguments, i.e.,  $R' = R \cup \{(p, p'), (p', p) \mid p, p' \in P\}$ . Lastly, the preferences in our CPAF correspond to the preferences of each audience and are controlled by the newly introduced audience-arguments, i.e., *cond* is defined such that for  $S \subseteq A'$  we have  $a \succ_S b$  iff there is  $p \in P$  with  $S \cap P = \{p\}$  and  $val(a) \succ_p val(b)$ . See Figure 3 for an example of this transformation.

Observe that the successful attacks in some AVAF  $F_p = (A, R, V, val, \succ_p)$  are also attacks in  $\mathscr{R}_1^{S \cup \{p\}}(Tr(F))$ , where  $S \subseteq A$ , and vice versa. Thus, the admissible sets in the initial VAF *F* stand in direct relationship to the admissible sets in our constructed CPAF.

**Lemma 8.** Let F = (A, R, V, val, P) be a VAF,  $S \subseteq A$ , and  $p \in P$ . Then S is admissible in the AVAF  $F_p = (A, R, V, val, \succ_p)$  iff  $S \cup \{p\} \in adm_{cp}^1(Tr(F))$ .

<sup>&</sup>lt;sup>3</sup>As for regular AFs, we say that an argument *x* is credulously (resp. skeptically) preferred in a CPAF w.r.t. Reduction *i* iff  $x \in S$  for some (resp. for all)  $S \in prf_{cp}^i(F)$ .

Note that all audience-arguments in Tr(F) attack each other, i.e., an admissible set in Tr(F) contains at most one audience-argument. In fact, each audience-argument defends itself, and thus every preferred extension in Tr(F) must contain exactly one audience-argument  $p \in P$  if we appeal to the  $prf_{cp}^1$ -semantics. Therefore, the direct correspondence between admissible sets observed in Lemma 8 carries over to preferred extensions.

**Theorem 9.** Given a VAF F = (A, R, V, val, P),  $x \in A$  is subjectively (resp. objectively) accepted in F iff x is credulously (resp. skeptically) preferred in Tr(F) w.r.t. Reduction 1.

Our translation highlights the versatility of our formalism. On the one hand, conditional preferences can be tied to dedicated arguments (in this case the audiencearguments). On the other hand, these dedicated arguments themselves may be part of the argumentation process. Note that we used CPAFs with Reduction 1 since preferences in VAFs are usually handled by deleting attacks. However, our approach also allows for the use of other preference-reductions in VAF-settings.

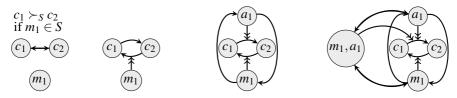
#### 5.2. Relationship to Extended Argumentation Frameworks

EAFs allow arguments to express preferences between other arguments by permitting attacks themselves to be attacked. While EAFs are related to our CPAFs conceptually, we will see that there are crucial differences in how exactly preferences are handled.

Formally, an EAF is a triple (A, R, D) such that (A, R) is an AF,  $D \subseteq A \times R$ , and if  $(a, (b, c)), (a', (c, b)) \in D$  then  $(a, a'), (a', a) \in R$ . The definition of admissibility in EAFs is quite involved and requires so-called reinstatement sets. Essentially, a set of arguments *S* is admissible in an EAF if all arguments  $x \in S$  are defended from other arguments  $y \in A \setminus S$ , and if all attacks (z, y) used for defending *x* are in turn defended from attacks on attacks (w, (z, y)) and thus reinstated. It is possible that a chain of such reinstatements is required which is formalized with the aforementioned reinstatement sets. Formally defining these concepts is not necessary for our purposes, but the corresponding definitions can be found in [12]. Observe that the notion of attacks on attacks in EAFs is similar to Reduction 1 in the sense that attacks between arguments can be unsuccessful, but they are never reversed. Therefore, we will compare EAFs to CPAFs with Reduction 1.

Recall our Sherlock Holmes example from the introduction (Example 1) that we modeled as a CPAF (Example 3). Let us first consider a slimmed-down variation without an argument stating that Person 1 has an alibi. We can model this as an EAF with three arguments  $c_1$  (Person 1 is the culprit),  $c_2$  (Person 2 is the culprit), and  $m_1$  (Person 1 has a motive) in which  $m_1$  attacks the attack from  $c_2$  to  $c_1$ . The corresponding EAF is depicted in Figure 4b. Compare this to the formalization via a CPAF in Figure 4a. Note that  $\{c_1\}$  is admissible in the EAF but  $\{c_2\}$  is not since  $(c_2, c_1)$  is used to defend against  $(c_1, c_2)$  but not reinstated against  $(m_1, (c_2, c_1))$ . In the CPAF,  $\{c_2\}$  is admissible (but not stable).

This simple example highlights a fundamental difference in how preferences are viewed in the two formalisms. In CPAFs, preferences are relevant exactly if the argument that expresses them (e.g.  $m_1$ ) are part of the set under inspection. In EAFs, preference are relevant even if the argument that expresses them is not accepted. Modgil [12] states that admissibility for EAFs was defined in this way because it was deemed important to satisfy Dung's Fundamental Lemma [15], which says that if *S* is admissible and *x* is acceptable w.r.t. *S* then  $S \cup \{x\}$  is admissible. This Fundamental Lemma is not satisfied in our CPAFs. However, in our opinion, this is no drawback but rather a necessary property



(a) Simple CPAF (b) Simple EAF (c) Conflicting preferences (d) Combining preferences

Figure 4. The Sherlock Holmes example modeled via EAFs and a simple CPAF.

of formalisms that can deal with conditional preferences in a flexible way. For example, in Figure 4a it is clear that  $\{c_2\}$  should be admissible since, when considering only admissibility, we are not forced to include the unattacked  $m_1$ , i.e., we do not have to accept that Person 1 has a motive. The inclusion of unattacked arguments in CPAFs is handled via more restrictive approaches such as stable or preferred semantics, as usual.

Another difference between CPAFs and EAFs becomes clear when considering the entire Sherlock Holmes example. Recall our formalization for CPAFs (cf. Figure 2). In order to express our preference in case Person 1 has an alibi we extend our EAF from Figure 4b by adding an attack from  $a_1$  to the attack  $(c_1, c_2)$ , as shown in Figure 4c. Note that  $a_1$  and  $m_1$  must attack each other in this EAF by definition since they express conflicting preferences. But this formalization is unsatisfactory since it should be possible for Person 1 to have both a motive and an alibi. The fact that the preference of one argument may change in view of another argument must be modeled indirectly in EAFs. For example, we can introduce an additional argument to express that Person 1 has both a motive and an alibi. This is depicted in Figure 4d. Thus, we can see that CPAFs allow for more flexibility when combining preferences associated with several arguments.

To summarize, CPAFs are designed to express conditional preferences in abstract argumentation, whereas preferences in EAFs are unconditional in the sense that they may always influence the argumentation process, even if the argument associated with the preference is not accepted. Moreover, since our CPAFs can make use of all four preference reductions, they allow for more flexibility in how preferences are handled compared to EAFs, in which unsuccessful attacks are always deleted. However, the two formalisms are similar in that arguments are capable of reasoning about the argumentation process itself, i.e., they constitute a form of metalevel argumentation [17].

## 6. Conclusion

In this paper, we introduce Conditional Preference-based AFs (CPAFs) which generalize PAFs and allow to flexibly handle conditional preferences in abstract argumentation. We show that the satisfaction of I-maximality can depend on how maximization is dealt with (in case of preferred semantics) and on which preference-reduction is chosen (in case of stable semantics). We conduct a principle-based analysis for CPAFs and show that complete and stable semantics satisfy the same principles as on PAFs in most cases while grounded semantics no longer satisfy the majority of principles. Moreover, we compare CPAFs to related formalisms: on the one hand we show that CPAFs can be used to capture VAFs via a straightforward translation; on the other hand, we demonstrate that CPAFs exhibit significant differences to EAFs in terms of how preferences are handled.

For future work, we plan to introduce an alternative grounded semantics which enforces unique extensions, examine the computational complexity of CPAFs, and consider restricted (e.g. transitive or linear) preference orderings. Moreover, we intend to investigate the relationship between CPAFs and existing approaches in structured argumentation [8] in detail. Related to this last point, it may also be interesting to see whether conditional preferences can be adapted to other formalisms such as bipolar argumentation frameworks [18], in which both attack and support relations are present. As for preference representation, it could be investigated how existing formalisms designed to handle conditional preferences such as CP-nets [19] can be used in the context of CPAFs.

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