# **Conflicts of Belief Functions: Continuity and Frame Resizement**

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**Abstract.** Plausibility and pignistic conflict of belief functions are briefly recalled in this study. These measures of conflict are based on two different probability transformations of belief functions, normalised plausibility of singletons *PLC* and Smets' pignistic probability *BetP*.

Continuity properties and relationship of these conflict measures to extension and refinement of a frame of discernment are investigated here. A new continuous improvement of both the measures which is preserved by a frame extension is introduced. A relation of the new conflict measures to refinement of a frame of discernment is also discussed. Finally a comparison between the new measure and the two original measures as well as W. Liu's degree of conflict *cf* is presented.

**Keywords:** Belief functions, Dempster-Shafer theory, uncertainty, plausibility conflict, pignistic conflict, degree of conflict, continuity, extension of a frame of discernment, refinement of a frame of discernment.

#### **1 Introducti[on](#page-12-0)**

When combining belief functions (BFs) by the [con](#page-13-1)junctive rules of combination, conflicts often appear (which are assigned to  $\emptyset$  by non-normalised conjunctive rule  $\odot$  or normalised by De[mp](#page-13-1)ster's rule of combination  $\oplus$ ). Combination of co[nfl](#page-13-2)icting BFs and inte[rpr](#page-13-3)etation of conflicts are often questionable in real applications. Thus a series of papers were published on alternative combination rules, conflicting belief functions, e.g. [2,4,13,15,16,22], and measures of conflicts, e.g. [12,17,18].

A new interpretation of conflicts of BFs was introduced in [6]. Important distinction of conflicts between B[Fs d](#page-13-4)ue to internal conflict of a single BF, and due to the difference between BFs was introduced there. The most elaborated perspective of the three approaches initiated in [6] — plausibility conflict of BFs — was analysed in [9] and improved in [10]. An alternative pignistic conflict based on Smets' pignistic probability BetP was introduced there as well.

The presented study investigates plausibility and pignistic conflicts from the point of view of continuity and resizement of a frame of discernment: extension

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and re[fine](#page-7-0)ment of the frame. New improvements of both the [m](#page-9-0)easures of conflicts between BFs with respect to these properties are presented.

Similarly to [6,9,10] we use W. Liu's assumption that conflict between BFs appears when the [B](#page-12-1)Fs strongly support mutually non-compatible hypotheses [16], and also the assumptions from [6] that there is no conflict between BFs when the BFs (strongly) support same or compatible hypotheses. Moreover, starting from Section 4, we assume continuity of conflict measures defined in Section 3; starting from Section 5, we assume keeping of conflictness/non-conflictness when extending a frame of discernment; and further, sta[rtin](#page-13-5)g from Section 6, we assume also keeping of conflictness/non-conflictness when refining the frame. Section 7 compares [a](#page-13-1)[nd](#page-13-2) [su](#page-13-3)mmarizes the presented results, several ideas for a future research are stated in Section 8.

## **2 State of the Art**

We assume classic definitions of basic notions from theory of belief functions [19] on finite frames of discernment  $\Omega_n = {\omega_1, \omega_2, ..., \omega_n}$ . Due to a limited space we do not repeat all the notions used in [[6,](#page-13-6)[9,1](#page-13-7)0], but only the important of those, which were introduced there.

A *basic belief assignment (bba)*  $m: \mathcal{P}(\Omega) \longrightarrow [0,1], \sum_{A \subseteq \Omega} m(A) = 1$ , its values are called *basic belief masses (bbms)*; a *belief function (BF)* Bel : P(Ω) −→ [0, 1],  $Bel(A) = \sum_{\emptyset \neq X \subseteq A} m(X)$ . A *plausibility function*  $Pl(A) = \sum_{\emptyset \neq A \cap X} m(X)$ . There is a unique correspondence between  $m$  and the corresponding Bel and Pl; thus we often speak about  $m$  as a belief function. A *focal element* is a subset  $X$ of the frame of discernment such that  $m(X) > 0$ . *[N](#page-13-2)[orm](#page-13-3)alised plausibility of sin*gletons corresponding to Bel:  $Pl\_P(\omega) = \frac{Pl(\{\omega\})}{\sum_{\omega' \in \Omega} Pl(\{\omega'\})}$  [3,5] (this is normalised contour function); *pignistic probability:*  $BetP(\omega) = \sum_{\omega \in X \subseteq \Omega} \frac{1}{|X|}$  $\frac{m(X)}{1-m(\emptyset)}$  [20].

We say that  $\omega \in \Omega$  is *supported* or *preferred* by a belief function Bel defined on  $\Omega_n$  when  $Pl_P(\omega) > \frac{1}{n}$ ,  $\omega$  is *opposed by Bel* if  $Pl_P(\omega) < \frac{1}{n}$ . Analogously for  $BetP(\omega)$  if Smets pignistic probability is used.  $U_n$  is a BF on  $\Omega_n$  such that  $m(\omega) = \frac{1}{n}$  for all  $\omega \in \Omega_n$ .

Conflict between BFs is distinguished from internal conflict in [6,9,10], where internal conflict of a BF is included inside the individual BF. Total conflict of two BFs  $Bel_1$ ,  $Bel_2$ , which is equal to sum of all conflicting belief mases:  $m_{\odot}(\emptyset) = \sum_{X \cap Y = \emptyset} m_1(X) m_2(Y)$ , includes internal conflicts of individual BFs  $Bel_1, Bel_2$  and a conflict between them. Thus two definitions were introduced in [6]; we are interested in conflict between belief BFs in this study.

**Definition 1.** *The* internal plausibility conflict Pl-IntC of BF Bel *is defined as*

$$
Pl-IntC(Bel) = 1 - max_{\omega \in \Omega} Pl(\{\omega\}),
$$

*where* Pl *is the plausibility corresponding to* Bel*.*

**Definition 2.** Let  $Bel_1$ ,  $Bel_2$  be two belief functions on  $\Omega_n$  given by bbms  $m_1$ and  $m_2$  which have normalised plausibility of singletons  $Pl\_P_1$  and  $Pl\_P_2$ . The

<span id="page-2-0"></span>conflicting set  $\Omega_{PlC}(Bel_1, Bel_2)$  *is defined to be the set of* elements  $\omega \in \Omega_n$ with conflicting Pl P masses *it is conditionally extended with union of sets*  $max$   $Pl P_i$  *value elements under condition that they are disjoint. Formally we have*  $\Omega_{PlC}(Bel_1, Bel_2) = \Omega_{PlC_0}(Bel_1, Bel_2) \cup \Omega_{smPlC}(Bel_1, Bel_2)$ ,  $where \Omega_{PlC_0}(Bel_1, Bel_2) = \{ \omega \in \Omega_n \mid (Pl_{-}P_{1}(\omega) - \frac{1}{n})(Pl_{-}P_{2}(\omega) - \frac{1}{n}) < 0 \},$  $\Omega_{smPIC}(Bel_1, Bel_2) = \{ \omega \in \Omega_n \mid \omega \in \{ max_{\omega \in \Omega_n} Pl \_{Pl}(\omega) \} \cup \{ max_{\omega \in \Omega_n} Pl \_{Pl}(\omega) \}$  $\& \{ max_{\omega \in \Omega_n} Pl_P(\omega) \} \cap \{ max_{\omega \in \Omega_n} Pl_P(\omega) \} \neq \emptyset \}.$ 

Plausibility co[n](#page-13-1)flict between BFs  $Bel<sub>1</sub>$  *and*  $Bel<sub>2</sub>$  *is then defined by the formula* 

$$
Pl-C(Bel_1, Bel_2) = min( Pl-C_0(Bel_1, Bel_2), (m_1 \odot m_2)(\emptyset)),
$$

*where*<sup>1</sup>

$$
Pl\text{-}C_0(Bel_1,Bel_2) = \sum_{\omega \in \Omega_{PLC}(Bel_1, Bel_2)} \frac{1}{2} |Pl\text{-}P(Bel_1)(\omega) - Pl\text{-}P(Bel_2)(\omega)|.
$$

There are two reasons for minimising with  $(m_1 \odot m_2)(\emptyset)$  (briefly with  $m_{\odot}(\emptyset)$ ) if  $Bel_1$  and  $Bel_2$  are clear from a context): at first the original from [6], see Example 1, where two obviously non-conflicting BFs have non-empty conflicting set and positive  $Pl-C_0$ , whereas  $m_{\mathcal{O}}(\emptyset) = 0$ ; the [seco](#page-13-3)nd is that  $m_{\mathcal{O}}(\emptyset)$  was found to be an upper bound for conflict between BFs [10].

*Example 1.* Let us suppose two categorical BFs on  $\Omega_6$  given by  $m_1(\{\omega_1\}) =$ 1 and  $m_2(\{\omega_1, \omega_2, \omega_3, \omega_4\}) = 1$ , thus  $Pl P_1 = (1, 0, 0, 0, 0, 0)$  and  $Pl P_2 =$  $(0.25, 0.25, 0.25, 0.25, 0.0)$  thus  $\Omega_{PlC} = {\omega_2, \omega_3, \omega_4}$  as  $PlP_1(\omega_i)=0 < \frac{1}{6}$  and  $PLP_2(\omega_i)=0.25 > \frac{1}{6}$  for  $i=1,2,3,4$  (other elements are [non](#page-13-3)-conflicting), hence  $Pl-C_0 = 0.375$  and this should be minimised with  $m_{\odot}(\emptyset) = 0$ .

Four variants of  $\Omega_{PlC}(Bel_1, Bel_2)$  are defined and analysed in [10]:  $\Omega_{smPlC}$ ,  $\Omega_{spPIC} = \Omega_{smPIC}(Bel_1, Bel_2) \cup \Omega_{PlC_0}(Bel_1, Bel_2)$  (as above),  $\Omega_{cpPIC}$  which includes  $\omega$  with different order of  $Pl\_P_i(\omega)$  values, and  $\Omega_{cbPlC} = \Omega_{cpPlC} (Bel_1, Bel_2)$  $\cup$   $\Omega_{PlC_0}(Bel_1, Bel_2)$ . I.e.,  $\Omega_{PlC}$  is constructed using either max  $PlP_i$  values, ordering  $Pl P_i$  values, support/opposition of elements of the frame of discernment (+ max  $Pl P_i$  values), or combination of these options; for detail see [10]. (All of these variants coincide on  $\Omega_2$ ).

*Example 2.* Four variants of conflicting sets. Let us suppose  $Bel_1$ ,  $Bel_2$  on  $\Omega_5$ .  $X : {\omega_1} {\omega_2} {\omega_3} {\omega_4} {\omega_5} {\omega_5} {\omega_2} {\omega_2} {\omega_4} {\omega_1 - \omega_3} {\omega_1 \omega_4} \Omega_5$ 

 $m_1(X)$ : 0.225 0.195 0.19 0.19 0.01 0.02 0.01 0.03 0.11 0.02  $m_2(X)$ : 0.110 0.410 0.16 0.00 0.01 0.03 0.04 0.02 0.09 0.05 We obtain  $Pl_{-}P_1 = (0.27, 0.25, 0.24.0.22, 0.02), Pl_{-}P_2 = (0.20, 0.40, 0.24.0.12, 0.04),$ and  $\Omega_{smPlC} = {\omega_1, \omega_2}, \ \Omega_{PlC_0} = {\omega_4}, \ \Omega_{spPlC} = {\omega_1, \omega_2, \omega_4}, \ \Omega_{cpPlC} = {\omega_1, \omega_2}$  $\{\omega_3\}$ , and  $\Omega_{cbPlC} = {\{\omega_1, \omega_2, \omega_3, \omega_4\}}$ , hence  $Bel_1$  and  $Bel_2$  are considered to be mutually conflicting by all variants of  $Pl-C$ , but values of conflict are different in this case:  $smPl-C(Bel_1, Bel_2) = 0.11$ ,  $spPl-C = 0.16$ ,  $cpPl-C = 0.11$ ,  $cbPl-C = 0.11$ 0.16. ( $\omega_3$  has different order of  $Pl P_i$  values thus it is included in both  $\Omega_{\rm cpPIC}$  and  $\Omega_{cbPlC}$  but both its  $Pl P_i$  values are the same:  $Pl P_1(\omega_3) = Pl P_2(\omega_3) = 0.24$ , thus  $smPl-C = cpPl-C$  and  $spPl-C = cbPl-C$  in this special case.

 $1$  *Pl*-*C*<sub>0</sub> is not a separate measure of conflict in general; it is just a component of *Pl*-*C*.

**Definition 3.** Let  $Bel_1$ ,  $Bel_2$  be two belief functions on  $\Omega_n$  given by bbms  $m_1$ and  $m_2$  which have pignistic probabilities  $BetP_1$  and  $BetP_2$ . The pignistic conflicting set  $\Omega_{BetC}(Bel_1, Bel_2)$  *is defined analogously to plausibility conflicting set*  $\Omega_{PlC}(Bel_1, Bel_2)$ , having analogously four variants  $\Omega_{smBetC}$ ,  $\Omega_{spBetC}$ ,  $\Omega_{cpPIC}$ *and*  $\Omega_{cbPlC}$ *, see [10].* 

Pignistic conflict between BFs  $Bel<sub>1</sub>$  *and Bel<sub>2</sub> is then defined by the formula* 

 $Bet\text{-}C(Bel_1, Bel_2) = min(Bet\text{-}C_0(Bel_1, Bel_2), (m_1 \textcirc m_2)(\emptyset)),$ *where*<sup>2</sup>

$$
Bet-C_0(Bel_1,Bel_2) = \sum_{\omega \in \Omega_{BetC}(Bel_1, Bel_2)} \frac{1}{2} | BetP_1(\omega) - BetP_2(\omega)|.
$$

Quantitative aspect of conflict — conflictness/non-conflictness is classified by emptyness/non-emptyness of related conflicting set by both Pl-C and Bet-C. Quantitative conflict is then computed only for mutually conflicting BFs.

Whereas qualitative values are computed for any pair of BFs by Liu's twocomponent degree of conflict  $cf = (difBetP_{m_i}^{m_j}, m_{\cap}(\emptyset))$  [10,16], where  $difBetP_{m_i}^{m_j}$  $= max_{A \subseteq \Omega}(|BetP_{m_i}(A) - BetP_{m_j}(A)|), m_{\cap}(\emptyset) = (m_1 \odot m_2)(\emptyset).$  Qualitative question of conflictness/non-conflictness is not addressed there, in fact; and 'high conflictness' / 'not high conflictness' is determined from the qualitative values using empirically/heuristically given threshold of conflict tolerance  $\varepsilon$ .

Unfortunately, jumps of  $Pl-C$  and  $Bet-C$  values were observed, see the following examples. Such a jump in conflict values is counter-intuitive, moreover neither  $m_\cap(\emptyset)$  nor the other component  $diff BetP_{m_i}^{m_j}$  of Liu's degree of conflict cf have similar jumps. Hence, we are interested in how to remove the jumps from conflict measures in this study, i.e., how to modify measures of conflict Pl-C and  $Bet-C$  to be continuous, or jump-free.

<span id="page-3-0"></span>*Example 3.* Let us suppose two BFs on  $\Omega_2$ :  $Bel_1 = (m_1(\{\omega_1\}), m_1(\{\omega_2\}) =$  $(0.8, 0.1)$   $(m_1({\omega_1, \omega_2})=1 - m_1({\omega_1}) - m_1({\omega_2}) = 0.1),$   $Bel_2 = (0.3, 0.3),$ thus we obtain  $Pl P_1 = (0.888, 0.111), Pl P_2 = (0.5, 0.5),$  hence these two BFs are non-conflicting. Let us suppose a very small change of  $Bel<sub>2</sub>$ , thus we expect zero conflict again or a very small conflict value corresponding to the very small change. Let  $Bel'_2 = (0.3, 0.31)$ , thus  $Pl\_P'_2 = (0.4964, 0.5036)$ , hence  $\Omega_{PlC}(Bel_1, Bel_2') = \Omega_2$  and  $Pl-C(Bel_1, Bel_2') = 0.3925$ , which is significantly higher than the slight changes made on  $m_2({\{\omega_2\}})$  and  $m_2({\{\omega_1,\omega_2\}})$  by 0.01. Analogously, we have  $BetP_1 = (0.85, 0.15), \, \overline{BetP_2} = (0.5, 0.5), \, \text{and} \, \overline{BetP_2'} =$  $BetP_1 = (0.85, 0.15), \, \overline{BetP_2} = (0.5, 0.5), \, \text{and} \, \overline{BetP_2'} =$  $BetP_1 = (0.85, 0.15), \, \overline{BetP_2} = (0.5, 0.5), \, \text{and} \, \overline{BetP_2'} =$  $(0.495, 0.505)$ , which leads to  $BetP-C(Bel_1, Bel_2) = 0$ ,  $BetP-C(Bel_1, Bel'_2) = 0$ 0.355.

Let us suppose a free BF  $Bel_1 = (a_1, b_1)$  and a fixed BF  $Bel_2 = (a_2, b_2)$  on  $\Omega_2$ , such that  $Pl \_P2 = (u, 1 - u)$  where  $u \geq \frac{1}{2}$ . We can show how the value  $Pl-C(Bel_1, Bel_2)$  depends on the value  $Pl\_P_1(\omega_1)$  (i.e.,  $Pl\_P_1(\omega_1) = \frac{1-b_1}{2-a_1-b_1}$ , as  $Pl\_P_1(\omega_2) = 1 - Pl\_P_1(\omega_1)$  and u is fixed). A jump is obvious at  $Pl\_P_1(\omega_1) = \frac{1}{2}$ , see Fig. 1. For another example of jumps of conflict see Example 4.

 $2$  *Bet-C*<sub>0</sub> is again not a separate measure of conflict in general; it is just a component of *Bet*-*C*.



<span id="page-4-0"></span>

**Fig. 1.** Jump of  $Pl-C$  **Fig. 2.** A comparison of approaches

*Example 4.* Let us suppose BFs on  $\Omega_4$  given by the following table now:  $X : {\omega_1} {\omega_2} {\omega_3} {\omega_4} {\omega_1} {\omega_2} {\omega_4} {\omega_3} {\omega_4}$ 

			$\Lambda$ : $\{\omega_1\}$ $\{\omega_2\}$ $\{\omega_3\}$ $\{\omega_4\}$ $\{\omega_1,\omega_2\}$ $\{\omega_4,\omega_3\}$ $\Omega_4$		
$m_1(X): 0.15 \t0.15 \t0.15 \t0.15 \t0.01$				0.39	
$m_2(X)$ : 0.15 0.15 0.15 0.15				$0.01 \quad 0.39$	
$m_3(X)$ : 0.20 0.15 0.10 0.05 0.15				$0.05$ 0.30	
$m_4(X)$ : 0.90 0.03 0.02			0.01	$0.01 \quad 0.03$	
			$\mathbf{D1} \quad \alpha \qquad (\alpha \text{ or } \alpha \$		

 $Pl_{\rm C}$  = (0.2523, 0.2523, 0.2477, 0.2477),  $Pl_{\rm C}$  = (0.2477, 0.2477, 0.2523, 0.2523),  $Pl_{-}C_3 = (0.3095, 0.2857, 0.2143, 0.1905), Pl_{-}C_4 = (0.8468, 0.0631, 0.0541, 0.0360),$  $Pl-C(Bel<sub>1</sub>, Bel<sub>3</sub>) = 0$ ,  $Pl-C(Bel<sub>2</sub>, Bel<sub>3</sub>) = 0.0998$ , which is about ten times larger than the changes on  $\{\omega_1, \omega_2\}$  and  $\{\omega_3, \omega_4\}$  by 0.01.

 $smPl-C(Bel_1, Bel_4) = cpPl-C(Bel_1, Bel_4) = 0, spPl-C(Bel_1, Bel_4) =$  $cbPl-C(Bel<sub>1</sub>, Bel<sub>4</sub>)=0.2027, smPl-C(Bel<sub>2</sub>, Bel<sub>4</sub>)=0.5068, cpPl-C(Bel<sub>2</sub>, Bel<sub>4</sub>)$  $= 0.5991$ ,  $spP1-C(Bel_2, Bel_4) = 0.5068$ ,  $cbP1-C(Bel_2, Bel_4) = 0.5991$ , all the changes on conflict values are significantly greater than the difference between  $m_1$  values and  $m_2$  values (i.e., 0.01).

# **3 Continuity of Measures of Conflict between Belief Functions**

Let us define continuity of a measure of conflict using the conventional  $\epsilon - \delta$ way. That is, we first define a  $\delta$ -surrounding for any BF, and we then use  $\delta$ surrounding to define continuity of conflict measures.

Formally, we have the following definitions.

**Definition 4.** We say that a belief function  $Bel'$  is in  $\delta$  surrounding of a belief *function* Bel (briefly  $Bel' \in \delta(Bel)$ ) if  $|m(X) - m'(X)| \leq \delta$ .

**Definition 5.** We say that a measure of conflict of belief functions conf is con*tinuous if for any*  $\varepsilon > 0$  *and any BFs Bel<sub>1</sub>*, *Bel<sub>2</sub>*, *there exits a*  $\delta$  *surrounding of*  $Bel_1$ , such that for any  $Bel' \in \delta(Bel_1)$ ,  $|conf(Bel', Bel_2) - conf(Bel_1, Bel_2)| \leq \varepsilon$ . **Lemma 1.** *(i)*  $(m_1 \odot m_2)(\emptyset)$  *is continuous measure of conflict.*  $(iii)$   $min(conf(Bel<sub>1</sub>, Bel<sub>2</sub>), (m<sub>1</sub> \odot m<sub>2</sub>)( $\emptyset$ ))$  *is continuous for any continuous mea* $sure$  of conflict conf and any pair of BFs Bel<sub>1</sub>, Bel<sub>2</sub> given by  $m_1$  and  $m_2$ . (*iii*)  $min(difBet_{Bel_1}^{Bel_2}, (m_1 \odot m_2)(\emptyset))$  *is a continuous measure of conflict of BFs.* 

*Proof.* Proofs are verifications of the statements, for detail see [11].

## **4 Continuous Improvement of Plausibility and Pignistic Conflicts**

There is a non-conflicting area around any [BF](#page-4-0) (a half of the belief triangle in the case of BFs on  $\Omega_2$ ; there is a possibility of different variants of such areas using different conflicting sets  $\Omega_{PlC}$  (or  $\Omega_{BetC}$ ) for BFs on  $\Omega_n$ ,  $n > 2$ ). The idea is that conflict is zero on the border of conflicting area and it should continually increase without any jump behind the border. In the case of  $\Omega_2$ , we compute a difference of  $Pl \ P$  (or  $Bet P$ ) from  $U_2$ ; for obtaining continuity we use minimal difference. Its value should be doubled to obtain normalised conflict, i.e. to obtain conflict between  $(1,0)$  and  $(0,1)$  equal to 1; see green line in Fig. 2, for simple (non doubled) difference see blue line. This is equal to the sum of minimal differences over  $\Omega_{PlC}$  (it is  $\emptyset$  or entire  $\Omega_2$  in the case of  $\Omega_2$ ). Thus we obtain the following modification of  $Pl-C_0$ :

$$
Pl-C_1(Bel_1, Bel_2) = Pl-C_0(Bel_1, Bel_2) = 0,
$$
  
if  $(Bel_1(\{\omega_1\}) - Bel_1(\{\omega_2\})) (Bel_2(\{\omega_1\}) - Bel_2(\{\omega_2\})) \ge 0.$   

$$
Pl-C_1(Bel_1, Bel_2) = 2 \ min ( |PL_P(Bel_1)(\omega_1) - \frac{1}{2}|, |PL_P(Bel_2)(\omega_1) - \frac{1}{2}| )
$$
  

$$
= \sum_{i=1,2} \ min ( |PL_P(Bel_1)(\omega_i) - \frac{1}{2}|, |PL_P(Bel_2)(\omega_i) - \frac{1}{2}| );
$$

as  $Pl\_P(Bel_i)(\omega_2)=1 - Pl\_P(Bel_i)(\omega_1)$  for  $i = 1, 2$ .

The situation is more complicated on  $\Omega_n = {\omega_1, \omega_2, ... \omega_n}$ : We have to distinguish two parts of  $\Omega_{PlC}(Bel_1, Bel_2): \Omega_{PlC}^{opp}(Bel_1, Bel_2) \dots \omega$ 's which are opposed by  $Bel_1$  and  $Bel_2$  (i.e. where  $(Bel_1(\omega) - \frac{1}{n})(Bel_2(\omega) - \frac{1}{n}) < 0$ ) and  $\Omega_{PlC}^{ord}(Bel_1, Bel_2) = \Omega_{PlC}(Bel_1, Bel_2) \setminus \Omega_{PlC}^{opp}(Bel_1, Bel_2) \dots \omega^{\frac{n}{3}}$  from corresponding  $\Omega_{cpPIC}$  and  $\Omega_{cbPIC}$  which have different order of  $Pl\_P(Bel_i)(\omega)$  values, but they are not opposed by  $Bel<sub>1</sub>$  and  $Bel<sub>2</sub>$ , thus we have to handle them separately.

Let us assume that all  $\omega$ 's from  $\Omega_{PlC}(Bel_1, Bel_2)$  are opposed by  $Bel_1$  and  $Bel_2$ , i.e.  $\Omega_{PlC}^{ord}(Bel_1, Bel_2) = \emptyset$ , now. We can compute  $Pl-C_1(Bel_1, Bel_2)$  'per elements' directly in the same way as it is computed on  $\Omega_2$ :

$$
Pl-C_1(Bel_1, Bel_2) = \sum_{\omega \in \Omega_{PLC}(Bel_1, Bel_2)} min(|Pl\_P(Bel_1)(\omega) - \frac{1}{n}|, |Pl\_P(Bel_2)(\omega) - \frac{1}{n}|).
$$

Let us look at the following example of belief functions  $Bel_1$ , ...,  $Bel_4$  on  $\Omega_{10} = {\omega_1, \omega_2, ..., \omega_{10}}$  such that,  $Pl \_P_1(\omega_1) = 1$ ,  $Pl \_P_2(\omega_{10}) = 1$ . In this case,

we obtain  $\Omega_{PlC}(Bel_1, Bel_2) = \Omega_{PlC}^{opp}(Bel_1, Bel_2) = {\omega_1, \omega_{10}}$ ,  $Pl-C_1(Bel_1, Bel_2)$  $=\sum_{\omega \in \Omega_{PLC}} min\left(|Pl \_P_1(\omega) - \frac{1}{10}|, |Pl \_P_2(\omega) - \frac{1}{10}| \right) = \frac{1}{10} + \frac{1}{10} = \frac{2}{10}.$  $Pl_{-}P_{3}(\omega_{1}) = Pl_{-}P_{3}(\omega_{2}) = \frac{1}{2}, \, Pl_{-}P_{4}(\omega_{9}) = Pl_{-}P_{4}(\omega_{10}) = \frac{1}{2}, \, \Omega_{PlC}(Bel_{3}, Bel_{4})$ =  $\Omega_{PlC}^{opp}(Bel_3, Bel_4) = {\omega_1, \omega_2, \omega_9, \omega_{10}}$ , thus  $Pl-C_1(Bel_3, Bel_4) = 4 \cdot \frac{1}{10} = \frac{4}{10}$ . The conflict between two different categorical singletons  $Pl-C_1(Bel_1, Bel_2)$  should be maximal/greatest (as different elements (disjoint hypotheses) are fully (categorically) supported). More precisely, it should be equal to 1 for normalised conflict. Moreover conflict  $Pl-C_1(Bel_1, Bel_2)$  should be the same or greater than conflict  $Pl-C_1(Bel_3, Bel_4)$ , definitely not a half of it.

Considering the above example, we have to proportionalise comparison of  $Pl\_P(Bel_j)(\omega_i)$  with  $\frac{1}{n}$ ; i.e., to multiply  $|Pl\_P(Bel_j)(\omega_i) - \frac{1}{n}|$  by appropriate coefficient(s):

- a coefficient  $\frac{n}{2}$  determined by the size of frame of discernment;

this factor is equal to  $\frac{2}{2} = 1$  for  $n = 2$ ;

- a coefficient  $\frac{1}{2}(\overline{Pl}_-P(\overline{Bel}_1)(\omega_i)+\overline{Pl}_-P(Bel_2)(\omega_i)),$ 

i.e., by the relative size of sum of relative plausibilities of corresponding  $\omega_i$ . Thus we obtain:

$$
Pl-C_{11}(Bel_1, Bel_2) = \sum_{\omega \in \Omega_{PLC}(Bel_1, Bel_2)} \frac{n}{2} \frac{Pl_{-}P_{1}(\omega) + Pl_{-}P_{2}(\omega)}{2} \ min_{i=1,2} (|Pl_{-}P_{i}(\omega) - \frac{1}{n}|).
$$

For proving [of](#page-2-0) continuity of  $Pl-C_{11}$  we will use the following technical lemma, for proofs see [11].

**Lemma 2.** *(i)* For any BFs Bel and Bel' on  $\Omega_n$  such that Bel'  $\in \delta(Bel)$  for  $\delta = \frac{\varepsilon}{2^{n-1}}$  *it holds that*  $|PLP(\omega) - PLP'(\omega)| \leq \varepsilon$  *for any*  $\omega \in \Omega_n$ *. (ii)* For any BFs Bel<sub>1</sub>, Bel<sub>2</sub> and Bel' on  $\Omega_n$  such that Bel'  $\in \delta(Bel_1)$  for  $\delta \leq$  $min_{\omega_i \in \Omega_n} |PL_{1}(\omega_i) - \frac{1}{n}|$  *it holds that*  $\Omega_{PlC}(Bel', Bel_2) = \Omega_{PlC}(Bel_1, Bel_2)$ .

Analogously to the original version  $Pl-C_0$  we need to minimize  $m_{\mathcal{O}}(\emptyset)$  (also for  $Pl-C_{11}$ , see BFs and  $\Omega_{PlC}$  from Examp[le 1](#page-13-3) again. From the previous proof and Lemma 1 we obtain also continuity of  $min(PI-C_{11}, m_{\odot}(\emptyset))$ .

For  $\omega \in \Omega_{PlC}^{ord}$  we cannot use min of  $(Pl_{\Box}P(\omega) - \frac{1}{n})$  as both the BFs are in accordance with respect to  $\omega$ , and both of them support (or oppose)  $\omega$  (thus min may be relatively high for BFs with same or similar  $Pl_P(\omega)$  and, on the other hand, it is very small for  $Pl_{-}P_{1}(\omega)$  close to  $\frac{1}{n}$  and  $Pl_{-}P_{2}(\omega)$  close to 0 or 1.) Hence we have to use difference of differences, i.e., we have  $||P1-P_1(\omega)-\frac{1}{n}| |PLP_2(\omega) - \frac{1}{n}|| = |PLP_1(\omega) - PLP_2(\omega)|$  as it is in  $PLC$  (see [10]).

Thus we obtain the following formula:

$$
Pl-C_{12}(Bel_1, Bel_2) = \sum_{\omega \in \Omega_{PlC}^{opp}(Bel_1, Bel_2)} \frac{n}{2} \frac{Pl_{-}P_{1}(\omega) + Pl_{-}P_{2}(\omega)}{2} \ min_{i=1,2}(|Pl_{-}P_{i}(\omega) - \frac{1}{n}|)
$$

$$
+ \sum_{\omega \in \Omega_{PlC}^{ord}(Bel_1, Bel_2)} (|Pl_{-}P_{1}(\omega) - Pl_{-}P_{2}(\omega)|).
$$

<span id="page-7-1"></span><span id="page-7-0"></span>A difference of Pl P values is continuous, thus continuity is not lost upgrading  $Pl-C_{11}$  to  $Pl-C_{12}$ .

The situation is analogous for *Bet-C*. For proving of continuity of  $Bet-C_{12}$ , where  $BetP$ 's are used instead of  $Pl\_P$ 's; we use the analogy of Lemma 2:

**Lemma 3.** *(i)* For any BFs Bel and Bel' on  $\Omega_n$  such that Bel'  $\in \delta(Bel)$  for  $\delta = \frac{\varepsilon}{2^{n-1}}$  *it holds that*  $|BetP(\omega) - BetP'(\omega)| \leq \varepsilon$  *for any*  $\omega \in \Omega_n$ *. (ii)* For any BFs Bel<sub>1</sub>, Bel<sub>2</sub> and Bel' on  $\Omega_n$  such that Bel'  $\in \delta(Bel_1)$  *for*  $\delta \leq$  $min_{\omega_i \in \Omega_n} | BetP_1(\omega_i) - \frac{1}{n}|$  *it holds that*  $\Omega_{BetC}(Bel', Bel_2) = \Omega_{BetC}(Bel_1, Bel_2)$ .

For proofs see [11].

#### **5 Extension of a Frame of Discernment**

We have to note a relationship of  $Pl-C_{12}(Bel_1, Bel_2)$  to resizement of a frame of discernment. An extension of a frame of discernment is to add one or more elements into the frame of discernment but keeping the BFs not changed. More precisely, let us suppose a frame  $\Omega_m = {\omega_1, \omega_2, ..., \omega_m}$  and BFs  $Bel_i$ 's given by bbms  $m_i$ 's. Let us extend the frame with  $\{\omega_{m+1},...,\omega_{m+k}\}\)$  for  $m\geq 2, k\geq 1$ . Let  $Bel_i$ 's be given by  $m_i'$ 's such that  $m_i'(X) = m_i(X)$  for  $X \subseteq \Omega_m$ ,  $m_i'(X) = 0$ for  $X \cap \{\omega_{m+1},...,\omega_{m+k}\}\neq \emptyset$ . Thus we have  $Pl \_P'(\omega) = Pl \_P_i(\omega)$  for  $\omega \in \Omega_m$ and  $Pl \_P'(\omega) = 0$  for  $\omega \in \Omega_{m+k} \setminus \Omega_m$ . Comparing  $Pl \_P'(\omega)$  with  $\frac{1}{m+k} < \frac{1}{m}$ some  $\omega$ 's may be opposed by one of both  $Bel_i$ 's but supported by  $Bel_i$ 's. If such  $\omega$  is opposed by just one of  $Bel_i$ 's and supported by both  $Bel_i'$ 's, or it is opposed by both  $Bel_i$ 's and supported just by one of  $Bel_i'$ 's, there may be  $\Omega_{PlC}^{\prime opp} \subsetneq \Omega_{PlC}^{opp}$  or  $\Omega_{PlC}^{\prime opp} \supsetneq \Omega_{PlC}^{opp}$  (or  $\Omega_{PlC}^{\prime opp} = \Omega_{PlC}^{opp}$  of course). Hence conflict may be increased or decreased with greater or less conflicting set on the extended frame of discernment.  $\Omega_{PlC}^{jord} = \Omega_{PlC}^{ord}$  as  $Pl P_i'(\omega) = Pl P_i(\omega)$  for  $\omega \in \Omega_m$  and  $Pl P'_i(\omega) = 0$  out of  $\Omega_m$ . See the following example:

Let  $\Omega_m = \Omega_3$ ,  $\Omega_{m+k} = \Omega_4$  and  $Bel_i$ 's are given by  $m_i$ 's as follows:

				$X : {\omega_1} {\omega_2} {\omega_3} {\omega_3} {\omega_1} \omega_2} {\omega_1} {\omega_2} {\omega_3} {\omega_2} {\omega_3} {\omega_1} {\omega_2} {\omega_3}$	
$m_1(X): 0.60$ 0.10 0.1					0.2
$m_2(X)$ : 0.20 0.05 0.35				0.3	0.1
$m_3(X)$ : 0.45 0.15 0.10			0.1		0.2
$m_4(X):$ 0.25 0.40				0.2	0.15

Thus we obtain the following normalised plausibilities:

 $Pl\_P_1 = (0.6, 0.2, 0.2) \dots Pl\_P'_1 = (0.6, 0.2, 0.2, 0.0),$ 

 $Pl\_P_2 = (0.2, 0.3, 0.5) \dots Pl\_P_2^{\prime} = (0.2, 0.3, 0.5, 0.0).$ 

Only  $\omega_1$  is supported on both the frames by  $Bel_1$  and  $Bel'_1$ ;  $\omega_2$ ,  $\omega_3$  (and  $\omega_4$ ) are opposed. Only  $\omega_3$  is supported by  $Bel_2$  on  $\Omega_3$ , but  $\omega_2$  and  $\omega_3$  are supported by  $Bel'_2$  on  $\Omega_4$ , thus we obtain different conflicting sets on the frames, namely,  $\Omega_{PlC}(\bar{B}el_1, Bel_2) = {\omega_1, \omega_3}$  on  $\Omega_3$ , whereas  $\Omega_{PlC}(Bel'_1, Bel'_2) = {\omega_1, \omega_2, \omega_3}$ on  $\Omega_4$ , as  $\frac{1}{4}$  <  $Pl \_P_2(\omega_2) = 0.3 = Pl \_P_2(\omega_2)$  <  $\frac{1}{3}$  and  $Pl \_P_1(\omega_2) = 0.2 < \frac{1}{4} < \frac{1}{3}$ . Hence conflicting set was increased with the extension of the frame.

Analogously  $\Omega_{PlC}(Bel_3, Bel_4) = {\omega_1, \omega_2, \omega_3} \supsetneq \Omega_{PlC}(Bel'_3, Bel'_4) = {\omega_1, \omega_3}.$ 

Behaviour of conflict  $Pl-C_{12}$  may be even more different on the original and extended frames in some cases. Let us look at the following example:



Thus we obtain the following normalised plausibilities:

 $Pl\_P_5 = (0.35, 0.35, 0.3) \dots Pl\_P'_5 = (0.35, 0.35, 0.3, 0.0),$ 

 $Pl\_P_6 = (0.5, 0.4, 0.1) \dots Pl\_P'_6 = (0.5, 0.4, 0.1, 0.0).$ 

 $\omega_1$  and  $\omega_2$  are supported by both Bel<sub>5</sub> and Bel<sub>6</sub> on both the frames,  $\omega_3$  is opposed by both BFs on  $\Omega_3$  but only by  $Bel_6'$  on  $\Omega_4$  whereas supported by  $Bel_5'$ , thus conflicting set  $\{\omega_3\}$  appears when extending the frame. Hence the extension makes conflict between two originally  $Pl-C_{12}$  non-conflicting BFs  $Bel_5$  and  $Bel_6$ . Analogously  $\Omega_{PlC}(Bel_7, Bel_8) = {\omega_3}$  becomes empty when extending the frame.

A very simple example is  $Pl-C_{12}$  from BFs  $(0.4, 0.6)$  and  $(0.65, 0.35)$  on  $\Omega_2$ which becomes non-conflicting by any extension of the frame.

The above problem of  $Pl-C_{12}$  with a change of conflicting sets when extending the frame of discernment is related only to  $Q_{PlC}^{opp}$  not to  $\Omega_{PlC}^{ord}$  as orderings of  $PLP(\omega_i)$  values are the same on the original  $\Omega_m$  and on corresponding extended  $\Omega_{m+k}$ . Thus the problem is related only to spPl-C, cbPl-C, not to smPl-C,  $c_{p}Pl-C$ . Hence we have obtained a new argument for using the latter versions of Pl-C.

We have either to accept a strange behaviour of  $Pl-C_{12}$  when extending the frame of discernment, or to change the definition of supporting/opposing elements by BFs to be independent of extension of the frame of discernment or to concentrate ourselves to  $smPl-C$ ,  $cpPl-C$  versions, as it is in the following.

Unfortunately, we are again at the beginning of the continuity problems. As  $smPl-C((0.5, 0.5), (0.9, 0.1)$  is zero for BFs on  $\Omega_2$  as  $\omega_1$  has maximal Pl P for both of them, but  $smPl-C((0.49, 0.51), (0.9, 0.1) = \frac{1}{2}(0.41 + 0.41) = 0.41$ . Moreover we have the same results and same problem regardless computing  $\frac{1}{2}(|PLP_1(\omega_1) - PLP_2(\omega_1)| + |PLP_1(\omega_2) - PLP_2(\omega_2)|)$  or  $\frac{1}{2}(|PLP_1(\omega_1) - PLP_1(\omega_2)|$  $+|PLP_2(\omega_1) - PLP_2(\omega_2)|$  on  $\Omega_2$ ; thus regardless whether we use differences of  $Pl P_i$  per elements or differences between max and max but one value of the same  $Pl\_P$  per BFs.

Nevertheless, we can apply the 'min idea' from  $Pl-C_1$  to differences of the max  $Pl P$ 's values from max but one values of  $Pl P$ 's  $(Pl P_1$  and  $Pl P_2)$  instead of differences of these values from  $\frac{1}{n}$ . Thus we obtain

$$
Pl-C_{13}(Bel_1, Bel_2) = min(|Pl - Pl_1(\omega_1) - Pl - Pl_2(\omega_2)|, |Pl - Pl_2(\omega_1) - Pl - Pl_2(\omega_2)|)
$$

for  $Bel_1, Bel_2$  on  $\Omega_2$  such that  $\Omega_{smPlC}(Bel_1, Bel_2) = \Omega_2$  on  $\Omega_2$ ; and generally

$$
Pl-C_{13}(Bel_1, Bel_2) = min(|Pl_{-}P_{1}(\omega_i) - Pl_{-}P_{1}(\omega_j)|, |Pl_{-}P_{2}(\omega_k) - Pl_{-}P_{2}(\omega_l)|)
$$

for  $Bel_1, Bel_2$  on general finite frame  $\Omega_n$ , where max  $Pl_P(\omega)$  values appear for  $\omega_i$  and  $\omega_k$ ,  $i \neq k$ , and  $Pl \ P_1(\omega_j)$ ,  $Pl \ P_2(\omega_l)$  are max but one values of  $Pl \ P_3$ ;

$$
Pl-C_{13}(Bel_1, Bel_2) = 0
$$

if sets of max values of  $Pl_{\perp}P_1$  and  $Pl_{\perp}P_2$  are not disjoint.

*[A](#page-13-9)* [pr](#page-13-9)oof of continuity. Let suppose a pair of BFs  $Bel_1$ ,  $Bel_2$  and a BFs  $Bel'$  in δ surrounding of  $Bel_1$ , such that  $|m_1(X) - m'(X)| \leq \delta = \frac{\varepsilon}{2^n}$ , thus  $|Pl_1(X) - ln(X)|$  $Pl'(X) \leq 2^{n-1} \frac{\varepsilon}{2^n} = \frac{\varepsilon}{2}$  for any  $X \subseteq \Omega$  and sequently also  $|PL_{P_1}^{P_1}(\omega) - PL_{P_1}^{P_1}(\omega)| \leq$  $\frac{\varepsilon}{2}$  for any  $\omega \in \Omega$ , hence we obtain  $|PLP_1(\omega_i) - PLP_1(\omega_j)| - |PLP'(\omega_i) - \Omega|$  $\tilde{P}L P'(\omega_j)| \leq |P L P_1(\omega_i)-PL P'(\omega_i)|+|P L P_1(\omega_j)-PL P'(\omega_j)| \leq \varepsilon$  and sequently  $|PL-C_{13}(Bel_1, Bel_2) - PL-C_{13}(Bel', Bel_2)| = |min(|PLP_1(\omega_i) - PLP_1(\omega_j)|,$  $|PLP_2(\omega_k)-PLP_2(\omega_l)|)-min(|PLP'(\omega_i)-PLP'(\omega_j)|, |PLP_2(\omega_k)-PLP_2(\omega_l)|)|$  $\leq \varepsilon$  (for detail see [11]). Hence  $Pl-C_{13}$  is continuous.

Values of  $m$ , Bel, Pl and of Pl  $\overline{P}$  are kept with an extension of the frame of discernment, thus also conflictness/non-conflictness and the size of  $Pl-C_{13}$  are kept with a frame extension. Thus using  $Pl-C_{13}$  instead of  $Pl-C_0$  we obtain a continuous improvement  $min(PL-C_{13}, m_{\cap}(\emptyset))$  of Pl-C which is preserved when extending the frame of discernment.

 $Pl-C_{13}$  is a modification or analogy of  $smPl-C$  in fact: i[f m](#page-7-1)ax but one value of  $Pl_{\perp}P_1$  appears for element(s) which has/have the max value of  $Pl_{\perp}P_2$  and vice versa then  $Pl-C_{13}$  coincides with sm version of  $Pl-C$  in some cases, but not in general. Thus, it seems neither easy nor useful useful to try to define a similar continuous improvement which is a modification of cpPl-C.

<span id="page-9-0"></span>The above problems of  $\Omega_{PlC}^{opp}$  and  $Pl-C_{12}$  are in the same way relevant also to  $\Omega_{BetC}^{opp}$  (not to  $\Omega_{BetC}^{ord}$ ) and  $Bet-C_{12}$ . Thus completely analogously to  $Pl-C_{13}$ , just using  $BetP$ 's instead of  $Pl\_{P}$ 's we can define  $Bet-C_{13}$ . Having Lemma 3, we can use also the above proof of continuity substituting  $Pl P$ 's with  $BetP$ 's. Values of  $BetP$  are also kept with an extension of the frame of discernment, thus conflictness/non-conflictness and the size of  $Bet-C_{13}$  are kept with a frame extension as well. Thus using  $Bet-C_{13}$  instead of  $Bet-C_0$  we obtain a continuous improvement  $min(Bet-C_{13}, m_{\Box}(\emptyset))$  of  $Bet-C$  which is preserved when extending the frame of discernment.

As in the case of  $Pl-C_{13}$ ,  $Bet-C_{13}$  is a modification of sm version conflict measure and it does not seems to be useful to try to define similar modification of cpBet-C.

## **6 Refinement of a Frame of Discernment**

There is a completely different case of resizement of a frame of discernment, or the refinement of a frame. In this case, there are no new elements added but some of the original is/are split into one or more new one(s), thus  $bbm(s)$  of the split singleton(s) is/are transferred to the corresponding resulting set(s) and bbms of

sets containing split element(s) are transferred to the corresponding larger sets.  $Pl\_P$  and  $BetP$  have different behaviour in this case, hence  $Pl-C$  and  $Bet-C$  as well.

We can easily show that using neither  $Bet-C_{12}$  or  $Bet-C_{13}$  conflictness or non-conflictness of a pair of BFs is kept when refining the corresponding frame of discernment. It is enough to show the simple examples of BFs on  $\Omega_2$  and its refinement to  $\{\omega_{11}; \omega_{12}; \omega_2\}$ . Let us suppose a non-conflicting pair  $(0.6, 0.4)$  and  $(0.8, 0.2)$  where both the BFs support  $\omega_1$  and oppose  $\omega_2$ . Refining the frame, we obtain  $m'_1({\{\omega_{11}, \omega_{12}\}}) = 0.6, m'_2({\{\omega_{11}, \omega_{12}\}}) = 0.8$  and  $BetP'_1 = (0.3, 0.3, 0.4)$ ,<br> $BetP'_2 = (0.4, 0.4, 0.2)$ , where  $\omega_{11}, \omega_{12}$  are supported by  $Bel'_2$  but opposed by Bel'<sub>1</sub> and  $\omega_2$  is supported by Bel'<sub>1</sub> but opposed by Bel'<sub>2</sub>. Thus Bet-C<sub>12</sub> conflict has appeared when refining the frame.  $\omega_2$  has max  $BetP'_1$  value, but max  $BetP'_2$ value appears at  $\omega_{11}$  and  $\omega_{12}$ , hence also Bet-C<sub>13</sub> conflict has appeared.

Let us further suppose  $Bel_3$  given by  $(0.2, 0.8)$  [on](#page-13-9)  $\Omega_2$ . Refining the frame we obtain  $m'_3(\{\omega_{11}, \omega_{12}\})=0.2$  and  $BetP'_3=(0.1, 0.1, 0.8)$ . Thus  $\omega_{11}, \omega_{12}$  are opposed by  $\overline{Bel}'_3$  and  $\omega_2$  is supported by  $Bel'_3,$  as by  $Bel'_1;$  moreover max  $BetP'_3$  value appears at  $\omega_2$  as in the case of  $BetP'_1$ . Hence two conflicting BFs  $Bel_1$  and  $Bel_3$ became both  $Bet-C_{12}$  and  $Bet-C_{13}$  non-conflicting when the frame was refined.

Note that we can use the same examples to show the same property for  $Bet-C$ and  $Bet-C_{11}$ .

On the other hand the  $Pl-C_{13}$  conflictness/non-conflicteness is preserved by refinement of the frame (see Corollary 2; for proof of the lemma see [11]):

**Lemma 4.** Ordering of Pl\_P values is not changed with a refinement of a frame *of discernment.*<sup>3</sup>

**Corollary 1.** *The sets of elements with the maximal (minimal) value of* Pl P *are the same (up to refinement) for a belief functions* Bel *and* Bel *on an extended frame of discernment.*

**Corollary 2.** *Measure of conflict* Pl*-*C<sup>13</sup> *keeps conflictness/non-conflictness of a pair of belief functions when the frame of discernment is refined.*

The situation is more complicated for  $Pl-C$ ,  $Pl-C_{11}$  and  $Pl-C_{12}$ : Orderings of the  $PLP$  values (and max/min values) are kept when refining a frame; thus also sm and cp versions of conflictness/non-conflictness. But there is possibility of change of support/opposition of other elements; thus change of  $sp\Omega_{PlC}$  and  $cb\Omega_{PlC}$  and also of sp and cb versio[ns](#page-11-0) of Pl-C, Pl-C<sub>11</sub> and Pl-C<sub>12</sub> conflictness/ non-conflictness.

## **7 A Comparison of the Presented [Me](#page-13-9)asures of Conflict**

Comparing the series of  $Pl-C$  using  $Pl-C_0$ ,  $Pl-C_{11}$ ,  $Pl-C_{12}$ ,  $Pl-C_{13}$  (and analogously Bet-C using Bet-C<sub>0</sub>, Bet-C<sub>11</sub>, Bet-C<sub>12</sub>, Bet-C<sub>13</sub>) we see step-wise improvement from  $Pl-C_0$  to  $Pl-C_{13}$  (and from  $Bet-C_0$  to  $Bet-C_{13}$ ) from the point of view of the investigated properties, see Table 1.

Unfortunately, after completion of this text, we have realized, that Lemma 4 and its corollaries hold true only under a special condition; for correction see [11].

$\mu$ operation $\rightarrow$							Come Comprone sinal val Dig val Extens. Extension remement remi-	
measure $\downarrow$		distinguish.					equal. Conf/NonCConf/NonCequal.	
$\emptyset$ (Diff $Pl_P$ )	$^{+}$			$+$ .			$+/- / N.A.$	$\neq$
сf				$+/-$			$C \leftrightarrow N / N.A.$	$\neq$
$Pl-C$				$+/-$	$\neq$	$C \leftrightarrow N$		$\neq$
$Bet-C$		$^+$		$+/-$	$\neq$	$C \leftrightarrow N$	$C \leftrightarrow N$	$\neq$
$Pl-C_{11}$		$^+$	$+/-$	$+/-$	$\neq$	$C \leftrightarrow N$	′*)	$\neq$
$Bet-C_{11}$		$^+$	$+/-$	$+/-$	$\neq$	$C \leftrightarrow N$	$C \leftrightarrow N$	$\neq$
$Pl-C_{12}$		$^+$	$+/-$	$+/-$	$\neq$	$C \leftrightarrow N$	′*)	$\neq$
$Bet-C_{12}$		$^+$	$+/-$	$+/-$	$\neq$	$C \leftrightarrow N$	$C \leftrightarrow N$	$\neq$
$Pl-C_{13}$		$^{+}$	$+/-$	$+/-$	$=$		$^+$	$\neq$
$Bet-C_{13}$		$^+$	$+/-$	$+$ / –			$C \leftrightarrow N$	$\neq$

<span id="page-11-0"></span>Table 1. A comparison of properties of conflict measures and their components property  $\cdot$  Cont. Conf. NonC SmallVal BigVal Extens. Extension Refinement Refin.

Explanation:

+ property is satisfied,

property is not satisfied / values are not acceptable,

 $+/-$  we can accept the values as an approximation of values of conflict,

C↔N **c**onflicting pair of BFs may become a **n**on-conflicting (and vice versa) when resizing the frame of discernment,

(\*) elements with maximal preprerence / opposition are the same,

nevertheless the property is not satisfied in general  $(cp \text{ and } cb \text{ conflicts}).$ Further we have to note that:

" $\emptyset$  (Diff Pl\_P)" is a Pl\_P version of cf (is has not been mentioned anywhere, it is here just for a comparison of the properties);

each of  $Pl-C$ ,  $Bel-C$ ,  $Pl-C_{12}$ ,  $Bel-C_{12}$  have four variants  $(sm, sp, cp, cb$  according to 4 variants of conflicting sets  $\Omega_{PlC}$  or  $\Omega_{BetC}$ );

Pl-C<sub>11</sub>, Bet-C<sub>11</sub> suppose  $\Omega_{PlC}^{ord} = \emptyset$ ,  $\Omega_{BetC}^{ord} = \emptyset$ , thus there are two variants of each of them  $(sm \text{ and } sp);$ 

 $Pl-C_{13}$ ,  $Bet-C_{13}$  classify conflictness/non-conflictness according to max and max but one values of  $Pl P_i$ ,  $BetP_i$  (there is the only variant analogous to sm but not the same as 2–4 elements play their role here).

The conflict measures using  $Pl-C_{13}$  and  $Bet-C_{13}$  are also simpler in comparison with previous both theoretically and from the computational point of view. Only a modified version of simple conflicting set is used there, hence there are not four variants  $(s_m, s_p, c_p, cb)$  and thus the computation is also simpler or equal in comparison with the previous measures.

In the case of the series of the measures based on  $BetP$  $BetP$ ,  $Bet-C$  using  $Bet-C_{13}$ is also improvement of Liu's degree of conflict  $cf$  from the point of view all these properties, whereas original version using  $Bet-C_0$  was improvement only from the point of view better and clearer distinguishing of conflictness/non-conflictness and using  $m_{\odot}$  as upper bound, on the other hand continuity and robustness with respect to an extension of a frame of discernment was lost.

When comparing  $Pl-C$  with  $Bet-C$  we have obtained a new argument in favour of Pl-C, that is its keeping of conflictness/non-conflictness when a frame of discernment is refined. The original arguments mentioned already in [10] are better interpretation of Pl-C and its compatibility with Dempster's rule based

<span id="page-12-1"></span>on commutativity of  $Pl\_P$  with Dempster's rule [3,5]. It is also strengthened by keeping zero/non-zero values by  $diffPLP_{m_i}^{m_j}$  (a  $PLP$  version of  $diffBetP_{m_i}^{m_j}$  when a frame of discernment is refined, see value " $+/-$  / N.A." in " $\emptyset$ " row of Table 1.

## **8 Open Problems and Ideas for a Future Research**

Investigating and improving measures of conflicts of BFs we have met the following open problems:

- **–** Pl-C<sup>13</sup> does not use conflicting sets, there is no problem with BFs from Example 1, thus there is a question whether it holds  $Pl-C_{13}(Bel_1, Bel_2) \leq$  $(m_1 \odot m_2)(\emptyset)$  or not.
- $-$  Analogously whether it holds  $Bet-C_{13}(Bel_1, Bel_2) \leq (m_1 \odot m_2)(\emptyset)$  or not.
- **–** To look for an alternative support/opposition of ω by a BF not depending from resizement of a frame of discernment.
- Investigation of an idea to use  $PLP$  or  $BetP$  for classification of conflictness/ non-conflictness only, and look for an appropriate distance of BFs (not transformed to probabilities) to use it for determination of conflict of BFs which were already classified as conflicting, i.e., which are in some positive conflict. (This partial "step back" may be either useful or a dead end procedure).

#### **9 Conclusion**

A series of gradual improvements of two measures of conflict between belief functions, plausibility conflict  $Pl-C$  and pignistic conflict  $Bet-C$ , are presented in this theoretical contribution. The measures are improved from the point of view of their continuity and robustness with respect to resizing of a frame of discernment: its extension and refinement. Bet-C is now a real improvement of Liu's degree of conflict  $cf$ .

<span id="page-12-0"></span>Higher robustness of  $Pl-C$  with respect to frame refinement is a new argument in favour of the measure based on normalised plausibility of singletons against the measure based on Smets' pignistic probability.

Improved conflict measures both increase our general understanding of the nature of belief functions and can be applied in better combination of conflicting belief functions in numerous applications of the real world.

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