



Fuzzy Preference Structures

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1. Introduction

“Alternative a is at least as good as alternative $b \dots$ ”

- **Boolean**: classical YES/NO
- **Discrete**: finite totally ordered set of (linguistic) values \mathcal{L}

None \preceq Very Low \preceq Low \preceq Medium

\preceq High \preceq Very High \preceq Perfect

- **Fuzzy**: evaluation scale is a compact real interval



2. *Boolean preference structures*



- Preference structure: result of
 - the pairwise comparison
 - of a set of alternatives A
 - by a decision maker

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- Preference structure: result of
 - the pairwise comparison
 - of a set of alternatives A
 - by a decision maker
- Consists of three binary relations on A :
 - strict preference relation P
 - indifference relation I
 - incomparability relation J

2. Boolean preference structures

- A **preference structure** on a set of alternatives A is a triplet (P, I, J) of relations in A that satisfy:
 - (B1) P is irreflexive, I is reflexive and J is irreflexive
 - (B2) P is asymmetric, I is symmetric and J is symmetric
 - (B3) $P \cap I = \emptyset$, $P \cap J = \emptyset$ and $I \cap J = \emptyset$
 - (B4) $P \cup P^t \cup I \cup J = A^2$

2. Boolean preference structures

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 - (B4) $P \cup P^t \cup I \cup J = A^2$

- (P, I, J) is a preference structure on A iff
 - (i) I is reflexive and I is symmetric
 - (ii) $P(a, b) + P(b, a) + I(a, b) + J(a, b) = 1$



2. Completeness condition (B4)



$$(C1) \quad \text{co}(P \cup I) = P^t \cup J$$

$$(C2) \quad \text{co}(P \cup P^t) = I \cup J$$

$$(C3) \quad \text{co}(P \cup P^t \cup I) = J$$

$$(C4) \quad \text{co}(P \cup P^t \cup J) = I$$

$$(C5) \quad \text{co}(P^t \cup I \cup J) = P$$

$$(C6) \quad P \cup P^t \cup I \cup J = A^2$$

2. Construction and characterization

- Given a reflexive relation R in A , the triplet (P, I, J) defined by

$$P = R \cap \text{co}(R^t)$$

$$I = R \cap R^t$$

$$J = \text{co}R \cap \text{co}(R^t)$$

is a preference structure on A such that

$$R = P \cup I \quad \text{and} \quad R^c = P^t \cup J$$

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is a preference structure on A such that

$$R = P \cup I \quad \text{and} \quad R^c = P^t \cup J$$

- Consider a preference structure (P, I, J) on A . Define its **large preference relation** R as

$$R = P \cup I$$

then (P, I, J) can be reconstructed from R .

3. Continuous de Morgan triplets

- A **t-norm** T is an increasing, commutative and associative binary operation on $[0, 1]$ with neutral element 1
 - minimum operator $T_{\mathbf{M}}(x, y) = \min(x, y)$
 - algebraic product $T_{\mathbf{P}}(x, y) = xy$
 - Lukasiewicz t-norm $T_{\mathbf{L}}(x, y) = \max(x + y - 1, 0)$

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 - Lukasiewicz t-norm $T_{\mathbf{L}}(x, y) = \max(x + y - 1, 0)$
- A **t-conorm** S is an increasing, commutative and associative binary operation on $[0, 1]$ with neutral element 0
 - maximum operator $S_{\mathbf{M}}(x, y) = \max(x, y)$
 - probabilistic sum $S_{\mathbf{P}}(x, y) = x + y - xy$
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 - bounded sum $S_{\mathbf{L}}(x, y) = \min(x + y, 1)$
- An **involution negator** N is an involutive decreasing permutation of $[0, 1]$
 - standard negator $N_s(x) = 1 - x$



3. Continuous de Morgan triplets



- N -dual t-conorm of a t-norm T is the t-conorm T^N :

$$T^N(x, y) = N(T(N(x), N(y)))$$

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- A de Morgan triplet M is a triplet of the type

$$(T, T^N, N)$$

(is called continuous if T is continuous)

- The Lukasiewicz triplet: (T_L, S_L, N_s)



3. The Frank t -norm family



• $s \in]0, 1[\cup]1, \infty[$:

$$T_s^{\mathbf{F}}(x, y) = \log_s \left(1 + \frac{(s^x - 1)(s^y - 1)}{s - 1} \right)$$

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$$T_s^{\mathbf{F}}(x, y) = \log_s \left(1 + \frac{(s^x - 1)(s^y - 1)}{s - 1} \right)$$

• limits:

$$\lim_{s \rightarrow 0} T_s^{\mathbf{F}}(x, y) = \min(x, y)$$

$$\lim_{s \rightarrow 1} T_s^{\mathbf{F}}(x, y) = xy$$

$$\lim_{s \rightarrow \infty} T_s^{\mathbf{F}}(x, y) = \max(x + y - 1, 0)$$

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$$\lim_{s \rightarrow \infty} T_s^{\mathbf{F}}(x, y) = \max(x + y - 1, 0)$$

- $T_0^{\mathbf{F}} = T_{\mathbf{M}}, T_1^{\mathbf{F}} = T_{\mathbf{P}}, T_{\infty}^{\mathbf{F}} = T_{\mathbf{L}}$

3. The Frank t -norm family

- Frank t -norm family: $(T_s^{\mathbf{F}})_{s \in [0, \infty]}$
- Frank t -conorm family: $(S_s^{\mathbf{F}})_{s \in [0, \infty]}$, $S_s^{\mathbf{F}} = (T_s^{\mathbf{F}})^*$
- Continuous irreducible solutions of the Frank equation:

$$T(x, y) + S(x, y) = x + y$$

4. Additive fuzzy preference structures

● Consider a continuous de Morgan triplet $M = (T, S, N)$.

An M -FPS on A w.r.t. completeness condition (C_i) ,

$i \in \{1, \dots, 6\}$, is a triplet (P, I, J) of binary fuzzy relations in A that satisfy:

- (i) P is irreflexive, I is reflexive and J is irreflexive
- (ii) P is T -asymmetric, I is symmetric and J is symmetric
- (iii) $P \cap_T I = \emptyset$, $P \cap_T J = \emptyset$ and $I \cap_T J = \emptyset$
- (iv) (P, I, J) satisfies completeness condition (C_i)



4. Completeness condition



$$(C1) \quad \text{co}_N(P \cup_S I) = P^t \cup_S J$$

$$(C2) \quad \text{co}_N(P \cup_S P^t) = I \cup_S J$$

$$(C3) \quad \text{co}_N(P \cup_S P^t \cup_S I) = J$$

$$(C4) \quad \text{co}_N(P \cup_S P^t \cup_S J) = I$$

$$(C5) \quad \text{co}_N(P^t \cup_S I \cup_S J) = P$$

$$(C6) \quad P \cup_S P^t \cup_S I \cup_S J = A^2$$

4. Completeness condition

● $p_i = (P, I, J)$ is an M -FPS on A w.r.t. (C_i)

- in general: no relationships
- in the case of the Lukasiewicz triplet: $i \in \{3, 4, 5\}$

$$\{p_1, p_2\} \Rightarrow p_i \Rightarrow p_6$$



4. Why use the *Lukasiewicz triplet*?



- **Assignment Principle:** the decision maker should be able to assign one of the degrees $P(a, b)$, $P(b, a)$, $I(a, b)$ and $J(a, b)$ freely in the unit interval ($a \neq b$)



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- The only suitable continuous de Morgan triplet is the **Lukasiewicz triplet**. (up to automorphism(s))

4. Why use the *Lukasiewicz triplet*?

- **Assignment Principle:** the decision maker should be able to assign one of the degrees $P(a, b)$, $P(b, a)$, $I(a, b)$ and $J(a, b)$ freely in the unit interval ($a \neq b$)
- The only suitable continuous de Morgan triplet is the **Lukasiewicz triplet**. (up to automorphism(s))
- Which completeness condition to use?
We suggest (C1):
 - strongest condition
 - axiomatic constructions

4. (Minimal) Definition

● An **additive fuzzy preference structure** on A is a triplet (P, I, J) of fuzzy relations in A that satisfy:

(F1) P is irreflexive, I is reflexive and J is irreflexive

(F2) P is T_L -asymmetric, I is symmetric and J is symmetric

(F3) $P \cap_L I = \emptyset$, $P \cap_L J = \emptyset$ and $I \cap_L J = \emptyset$

(F4) $\text{co}(P \cup_L I) = P^t \cup_L J$

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- (P, I, J) is an **additive fuzzy preference structure** on A iff

(i) I is reflexive and I is symmetric

(ii) $P(a, b) + P(b, a) + I(a, b) + J(a, b) = 1$

5. Axiomatic constructions

- Orlovski (78):

$$P(a, b) = \max(R(a, b) - R(b, a), 0)$$

$$I(a, b) = \min(R(a, b), R(b, a))$$

- Ovchinnikov (81):

$$P(a, b) = \begin{cases} R(a, b) & , \text{ if } R(a, b) > R(b, a) \\ 0 & , \text{ otherwise} \end{cases}$$

$$I(a, b) = \min(R(a, b), R(b, a))$$

5. Axiomatic considerations

- Roubens & Vincke (87):

$$P(a, b) = \min(R(a, b), 1 - R(b, a))$$

$$I(a, b) = \min(R(a, b), R(b, a))$$

$$J(a, b) = \min(1 - R(a, b), 1 - R(b, a))$$

- Roubens (89), Ovchinnikov & Roubens (91), Fodor (91)



5. Axiomatic considerations

- Consider a continuous de Morgan triplet $M = (T, S, N)$ and a reflexive binary fuzzy relation R in A . Construct

$$P = R \cap_T \text{co}_N R^t$$

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- When does it hold that $R = P \cup_S I$, i.e.

$$R = (R \cap_T \text{co}_N R^t) \cup_S (R \cap_T R^t)?$$

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- When does it hold that $R = P \cup_S I$, i.e.

$$R = (R \cap_T \text{co}_N R^t) \cup_S (R \cap_T R^t)?$$

- Answer: in general, **never** (Alsina, 1985).



5. Axioms of Fodor and Roubens



Consider a continuous de Morgan triplet (T, S, N) .

(IA) Independence of Irrelevant Alternatives:

$$P(a, b) = p(R(a, b), R(b, a))$$

$$I(a, b) = i(R(a, b), R(b, a))$$

$$J(a, b) = j(R(a, b), R(b, a))$$

(PA) Positive Association Principle: The mappings $p(x, N(y))$, $i(x, y)$ and $j(N(x), N(y))$ are increasing.

(S) Symmetry: The mappings i and j are symmetric.



5. Axioms of Fodor and Roubens



(LP) Preserving Large Preference:

$$P \cup_S I = R$$

$$P \cup_S J = \text{co}_N R^t$$

Underlying functional equations:

$$S(p(x, y), i(x, y)) = x$$

$$S(p(x, y), j(x, y)) = N(y)$$

5. Axioms of Fodor and Roubens

● If (T, S, N, p, i, j) satisfies the above axioms then

$$(T, S, N) = (T_{\mathbf{L}}, S_{\mathbf{L}}, N_s)$$

(up to automorphism) and, for any $(x, y) \in [0, 1]^2$:

$$\begin{aligned} T_{\mathbf{L}}(x, 1 - y) &\leq p(x, y) &&\leq \min(x, 1 - y) \\ T_{\mathbf{L}}(x, y) &\leq i(x, y) &&\leq \min(x, y) \\ T_{\mathbf{L}}(1 - x, 1 - y) &\leq j(x, y) &&\leq \min(1 - x, 1 - y). \end{aligned}$$

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- For any reflexive binary fuzzy relation R in A , the triplet (P, I, J) defined by means of (p, i, j) is an AFPS on A such that

$$R = P \cup_{\mathbf{L}} I \quad \text{and} \quad R^c = P^t \cup_{\mathbf{L}} J$$

5. Axioms of Fodor and Roubens

- Consider two continuous t-norms T_1 and T_2 . Define p and i by

$$p(x, y) = T_1(x, 1 - y)$$

$$i(x, y) = T_2(x, y)$$

then (T_L, S_L, N_s, p, i, j) satisfies the above axioms iff $\exists s \in [0, \infty]$ such that

$$T_1 = T_{1/s}^{\mathbf{F}}$$

$$T_2 = T_s^{\mathbf{F}}$$

In this case, we have that $j(x, y) = i(1 - x, 1 - y)$.

6. Characteristic behaviour

- Given a reflexive binary fuzzy relation R in A and $s \in [0, \infty]$, the triplet (P, I, J) defined by

$$(P, I, J) = (R \cap_{1/s} R^d, R \cap_s R^t, R^c \cap_s R^d)$$

is an AFPS on A such that $R = P \cup_{\mathbf{L}} I$ and $R^c = P^t \cup_{\mathbf{L}} J$. Note that

$$R(a, b) = P(a, b) + I(a, b)$$

6. Characteristic behaviour

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$$R(a, b) = P(a, b) + I(a, b)$$

- Characteristic behaviour:** Consider an AFPS (P, I, J) on A . Define its fuzzy large preference relation as

$$R = P \cup_{\mathbf{L}} I.$$

How can (P, I, J) be reconstructed from R ?

6. *T*-norm-based constructions

- An s -AFPS on A is an AFPS (P, I, J) on A that satisfies:

(D1) for $s \in \{0, 1, \infty\}$, the condition

$$P \cap_s P^t = I \cap_{1/s} J$$

(D2) for $s \in]0, 1[\cup]1, \infty[$, the condition

$$s^{P \cap_s P^t} + s^{-(I \cap_{1/s} J)} = 2$$

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(D2) for $s \in]0, 1[\cup]1, \infty[$, the condition

$$s^{P \cap_s P^t} + s^{-(I \cap_{1/s} J)} = 2$$

- Condition (D1) is equivalent to:

(i) for $s = 0$: $\min(P(a, b), P(b, a)) = 0$

(ii) for $s = 1$: $P(a, b) P(b, a) = I(a, b) J(a, b)$

(iii) for $s = \infty$: $\min(I(a, b), J(a, b)) = 0$

- Construction and characterization work!

6. *T-norm-based constructions*

Consider a reflexive binary fuzzy relation R in A , then we can construct the following fuzzy preference structures on A :

● a 0-AFPS (P_0, I_0, J_0) :

$$P_0(a, b) = \max(R(a, b) - R(b, a), 0)$$

$$I_0(a, b) = \min(R(a, b), R(b, a))$$

$$J_0(a, b) = \min(1 - R(a, b), 1 - R(b, a))$$

● a 1-AFPS (P_1, I_1, J_1) :

$$P_1(a, b) = R(a, b)(1 - R(b, a))$$

$$I_1(a, b) = R(a, b)R(b, a)$$

$$J_1(a, b) = (1 - R(a, b))(1 - R(b, a))$$

6. *T*-norm-based constructions

• an ∞ -AFPS $(P_\infty, I_\infty, J_\infty)$:

$$P_\infty(a, b) = \min(R(a, b), 1 - R(b, a))$$

$$I_\infty(a, b) = \max(R(a, b) + R(b, a) - 1, 0)$$

$$J_\infty(a, b) = \max(1 - R(a, b) - R(b, a), 0)$$

7. Generator triplets (with B. De Baets)

- A triplet (p, i, j) of $[0, 1]^2 \rightarrow [0, 1]$ mappings is called a **generator triplet** compatible with a continuous t-conorm S if for any reflexive fuzzy relation R on A it holds that the triplet (P, I, J) defined by:

$$P(a, b) = p(R(a, b), R(b, a))$$

$$I(a, b) = i(R(a, b), R(b, a))$$

$$J(a, b) = j(R(a, b), R(b, a))$$

is an AFPS on A such that

$$P \cup_S I = R$$

and

$$P^t \cup_S J = R^c$$

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is an AFPS on A such that

$$P \cup_S I = R \quad \text{and} \quad P^t \cup_S J = R^c$$

- If (p, i, j) is a generator triplet compatible with a continuous t-conorm S , then S must be nilpotent.

7. Generator triplets

- (p, i, j) is a generator triplet iff
- (i) $i(1, 1) = 1$
 - (ii) $i(x, y) = i(y, x)$
 - (iii) $p(x, y) + p(y, x) + i(x, y) + j(x, y) = 1$
 - (iv) $p(x, y) + i(x, y) = x$

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 - (iii) $p(x, y) + p(y, x) + i(x, y) + j(x, y) = 1$
 - (iv) $p(x, y) + i(x, y) = x$
- A generator triplet is uniquely determined by, for instance, the generator i :

$$p(x, y) = x - i(x, y)$$

$$j(x, y) = i(x, y) - (x + y - 1)$$

- $T_L \leq i \leq T_M$

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- A generator triplet is uniquely determined by, for instance, the generator i :

$$p(x, y) = x - i(x, y)$$

$$j(x, y) = i(x, y) - (x + y - 1)$$

- $T_L \leq i \leq T_M$

- From any symmetrical i such that $T_L \leq i \leq T_M$ a generator triplet can be built: **the** generator i



7. The arrival of quasi-copulas



- A generator triplet (p, i, j) is called **monotone** if:
 - (i) p is increasing in the first and decreasing in the second argument
 - (ii) i is increasing in both arguments
 - (iii) j is decreasing in both arguments

7. The arrival of quasi-copulas

- A generator triplet (p, i, j) is called **monotone** if:
 - (i) p is increasing in the first and decreasing in the second argument
 - (ii) i is increasing in both arguments
 - (iii) j is decreasing in both arguments
- A generator triplet (p, i, j) is **monotone** iff
 - i is a commutative quasi-copula
($i(0, x) = 0, i(1, x) = x$, increasing and 1-Lipschitz)

7. Frank again

● Consider a generator triplet (p, i, j) such that i is a t-norm, then the following statements are equivalent:

- (i) the mapping $j(1 - x, 1 - y)$ is a t-norm
- (ii) the mapping $p(x, 1 - y)$ is commutative
- (iii) i is an ordinal sum of Frank t-norms

and also the following ones:

- (iv) the mapping $p(x, 1 - y)$ is a t-norm
- (v) i is a Frank t-norm



8. Conclusion

- Definition, construction and characterization of AFPS
- Generator triplets: the indifference generator i
- Further work based only on i :
 - Propagation of transitivity-related properties (Ph.D. Susana Díaz)
- Future work: (appropriate classes of) left-continuous de Morgan triplets – how far can we go?