# How Potential BLFs Can Help to Decide under Incomplete Knowledge

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#### Introduction

Bipolar Layered Frameworks (BLFs) Awareness and K-Potential-BLF K-Potential-BLF and Decision Making Conclusion



- Qualitative decision problem
- Under incomplete knowledge
- Bipolar evaluation
- BLF = good visualization of
  - Connection between decision alternatives and goals,
  - Importance and Polarities of goals
- Aim: take into account completeness of knowledge.

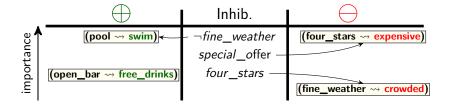
# Bipolar Layered Frameworks (BLFs)

Agent's information:

- set  $\mathcal{P}$  of decision principles (DP) in  $\mathscr{L}_F \times LIT_G$  $(\varphi, g) =$  defeasible rule "when  $\varphi$  (features) holds then g (goal) is generally achieved"
- polarity of goals:  $\oplus$ (desirable) and  $\ominus$  (undesirable)
- $\bullet\,$  relative importance of goals:  $\preceq\,$
- exceptions that inhibit defeasible rules:  $\mathcal{R} = \{(\psi, p) | \psi \in \mathscr{L}_F, p \in \mathcal{P}\}$

# Example of BLF: Find a hotel

- goals: swim ≃ expensive ≻ free\_drinks ≻ crowded
- features: {pool, open\_bar, four\_stars, fine\_weather, special\_offer}



# K-Valid-BLF

- Decision maker: knowledge K about alternative a
- $K \subseteq \mathscr{L}_F$  (features) supposed consistent
- Three kinds of knowledge about a:
  - $\varphi$  holds for candidate *a* (i.e.,  $K \models \varphi$ )
  - $\varphi$  does not hold ( $K \models \neg \varphi$ )
  - $\varphi$  is unknown for a  $(K \not\models \varphi \text{ and } K \not\models \neg \varphi)$

#### Definition (K-Valid-BLF)

Given K and BLF= $(\mathcal{P}, \mathcal{R}, pol, \preceq)$ A K-Valid-BLF is a quadruplet  $(\mathcal{P}_K, \mathcal{R}_K, pol, \preceq)$ 

•  $\mathcal{P}_{K} = \{(\varphi, g) \in \mathcal{P}, s.t. \ K \models \varphi\}$ DPs whose reason holds in K: K-valid-DPs.

•  $\mathcal{R}_{K} = \{(\psi, p) \in \mathcal{R}, s.t. \ K \models \psi\}$ : valid inhibitions wrt to K.

# Comparing alternatives

### Definition (realized goal)

A goal g is realized w.r.t. a K-Valid-BLF ( $\mathcal{P}_{K}, \mathcal{R}_{K}, \text{ pol}, \preceq$ ) iff

 $\exists (arphi, \mathsf{g}) \in \mathcal{P}_{\mathcal{K}} \text{ and } (arphi, \mathsf{g}) \text{ not inhibited in } \mathcal{R}_{\mathcal{K}}$ 

Definition (BiLexi decision rule (Bonnefon, Dubois, Fargier'08))

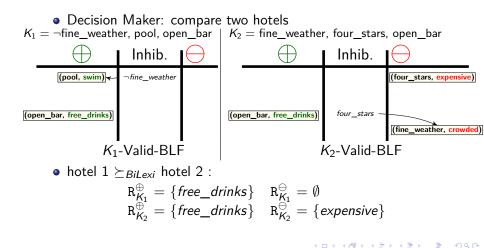
| Alternatives   | а | a'        |
|----------------|---|-----------|
| Knowledge      | K | <i>K′</i> |
| Realized goals | R | R′        |

$$R^{\oplus}=R\cap\overline{\oplus},\ R^{\ominus}=R\cap\overline{\ominus}.$$

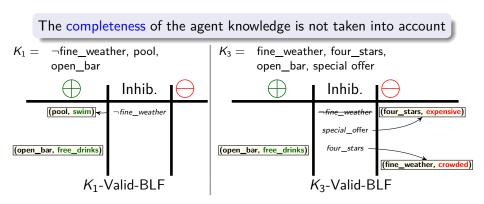
 $a \succeq_{\textit{BiLexi}} a' \quad \textit{ iff } |R^\oplus_\delta| \geq |R^{\prime\oplus}_\delta| \textit{ and } |R^\ominus_\delta| \leq |R^{\prime\ominus}_\delta|$ 

where  $\delta = \operatorname{argmax}_{\lambda}(\{|\mathtt{R}_{\lambda}^{\oplus}| \neq |\mathtt{R}_{\lambda}'^{\oplus}| \text{ or } |\mathtt{R}_{\lambda}^{\ominus}| \neq |\mathtt{R}_{\lambda}'^{\ominus}|\})$ 

# Example of K-Valid-BLF



### Weakness of K-Valid-BLF



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# K-Potential-BLF

#### Definition (K-Potential-BLF)

Given K and BLF=( $\mathcal{P}, \mathcal{R}, pol, \preceq$ ), the K-Potential-BLF is the quadruplet ( $\hat{\mathcal{P}}_{K}, \hat{\mathcal{R}}_{K}, pol, \preceq$ )

•  $\widehat{\mathcal{P}}_{\mathcal{K}}$ : potential DPs

 $\widehat{\mathcal{P}}_{\mathcal{K}} = \{ p \in \mathcal{P} \mid K \cup \{ reas(p) \} \text{ is consistent } \}$ 

•  $\widehat{\mathcal{R}}_{K}$ : potential inhibitions relation

 $\widehat{\mathcal{R}}_{\mathcal{K}} = \{(\psi, p) \in \mathcal{R} \mid \mathcal{K} \cup \{reas(p) \land \psi\} \text{ is consistent } \}$ 

 $\begin{aligned} &\mathcal{K}_{1}\text{-Potential-BLF: } \widehat{\mathcal{P}}_{\mathcal{K}_{1}} = \{p_{1}, p_{2}, p_{3}\} \\ &\widehat{\mathcal{R}}_{\mathcal{K}_{1}} = \{(\neg \textit{fine\_weather}, p_{1}), (\textit{special\_offer}, p_{3}), (\textit{four\_stars}, p_{4})\} \end{aligned}$ 

### Potential realization

| status     | Realized   | Not realized  |  |
|------------|--|---|--|
| notation   | $g\in \mathtt{R}_{\mathcal{K}}$  | $\pmb{g}\in\overline{\mathtt{R}}_{\mathcal{K}}$                                   |  |
| definition | $\exists p \in \mathcal{P}_{\mathcal{K}} \ \ concl(p) = g$ and   | $\forall p \in \mathcal{P}_{\mathcal{K}}$ either $concl(p)  eq g$                 |  |
|            | $\nexists(\psi, \boldsymbol{p}) \in \mathcal{R}_{\mathcal{K}}$   | or $\exists (\psi, {\pmb{p}}) \in {\mathcal{R}}_{{\mathcal{K}}}$                  |  |
| status     | Necessarily realized   | Possibly not realized   |  |
| notation   | $m{g}\in N$ R $_{K}$   | $g\in \Pi\overline{\mathtt{R}}_{\mathcal{K}}$                                     |  |
| definition | $\exists p \in \mathcal{P}_{\mathcal{K}} \ \ concl(p) = g$ and   | $orall p \in \mathcal{P}_{\mathcal{K}}$ either $concl(p)  eq g$                  |  |
|            | $ ot  ot = \widehat{\mathcal{R}}_{\mathcal{K}}$  | or $\exists (\psi, {m p}) \in \widehat{\mathcal{R}}_{\mathcal{K}}$                |  |
| status     | Potentially realized   | Potentially not realized  |  |
| notation   | $g\in P\mathtt{R}_{\mathcal{K}}$   | $g\in P\overline{\mathtt{R}}_{K}$   |  |
| definition | $\exists \pmb{p}\in \widehat{\mathcal{P}}_{\mathcal{K}} \ \ oldsymbol{concl}(\pmb{p})=\pmb{g} \ 	ext{and}$ | $orall p\in \widehat{\mathcal{P}}_{\mathcal{K}}$ either $\mathit{concl}(p) eq g$ |  |
|            | $ earrow(\psi, oldsymbol{ ho}) \in \widehat{\mathcal{R}}_{oldsymbol{\kappa}}$                              | or $\exists (\psi, {m p}) \in \widehat{\mathcal{R}}_{\mathcal{K}}$                |  |
| status     | Possibly realized  | Necessarily not realized  |  |
| notation   | $m{g}\in \Pi\mathtt{R}_{\mathcal{K}}$  | $g\in N\overline{\mathtt{R}}_{K}$   |  |
| definition | $\exists p\in \widehat{\mathcal{P}}_{\mathcal{K}} \ \ concl(p)=g  	ext{ and }$                             | $orall p\in \widehat{\mathcal{P}}_{\mathcal{K}}$ either $concl(p) eq g$          |  |
|            | $ eq (\psi, oldsymbol{p}) \in \mathcal{R}_{\mathcal{K}}$   | or $\exists (\psi, p) \in \mathcal{R}_{\mathcal{K}}$                              |  |

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# Link between K-Potential-BLF and K-Valid-BLF

#### Proposition

For any BLF ( $\mathcal{P}, \mathcal{R}, pol, \preceq$ ) and any knowledge base K

 $N \mathbb{R}_{\mathcal{K}} \subseteq \mathbb{R}_{\mathcal{K}} \subseteq \Pi \mathbb{R}_{\mathcal{K}}$  $N \mathbb{R}_{\mathcal{K}} \subseteq P \mathbb{R}_{\mathcal{K}} \subseteq \Pi \mathbb{R}_{\mathcal{K}}$ 

 $\begin{array}{l} \Pi \overline{\mathbb{R}}_{K} \subseteq \overline{\mathbb{R}}_{K} \subseteq N \overline{\mathbb{R}}_{K} \\ \Pi \overline{\mathbb{R}}_{K} \subseteq P \overline{\mathbb{R}}_{K} \subseteq N \overline{\mathbb{R}}_{K} \end{array}$ 

#### Definition (Sensitivity)

Sensitivity of a BLF  $(\mathcal{P}, \mathcal{R}, pol, \preceq)$  wrt K:

$$s(BLF, K) = \left| \frac{\Pi R_K}{N R_K} \right|$$

### Awareness

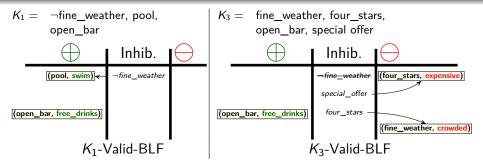
#### Definition

*K* is perfect knowledge wrt a BLF ( $\mathcal{P}, \mathcal{R}, pol, \preceq$ ) iff  $\forall \varphi \in \bigcup_{p \in P} \{reas(p)\} \cup \bigcup_{(\psi,p) \in \mathcal{R}} \{\psi\}, \text{ either } K \models \varphi \text{ or } K \models \neg \varphi.$ 

#### Proposition

For all BLF ( $\mathcal{P}, \mathcal{R}, pol, \preceq$ ), (K is a perfect knowledge wrt BLF)  $\Rightarrow$  ( $\widehat{\mathcal{P}}_{K} = \mathcal{P}_{K}$  and  $\widehat{\mathcal{R}}_{K} = \mathcal{R}_{K}$ )  $\Rightarrow$  s(BLF, K) = 0. But the converse does not necessarily hold.

# Refining the ordering of Candidates



 $1 \sim_{BiLexi} 3$  can be refined by using either  $NR_K$  or  $\Pi R_K$ .

- $NR_K$  is taken if the DM is skeptical
- $\Pi R_K$  if the DM is a believer

With  $NR_{K}$ :  $1 \sim_{BiLexi} 3$  while With  $\Pi R_{K}$ ,  $3 \succ_{BiLexi} 1$ .

Acquisition of Knowledge to Discriminate Alternatives

We consider that decision maker able to acquire knowledge

#### Definition

Given a BLF, a  $\varepsilon$  and K and K' describing alternatives a and a',

• a is ε-sensitivity-comparable to a' iff

$$|s(BLF, K) - s(BLF, K')| \le \varepsilon$$

 a is BiLexi-preferred to a' with ε-sensitivity awareness iff they are ε-sensitivity-comparable and a ≿<sub>BiLexi</sub> a'

# Acquisition of Knowledge to Discriminate Candidates

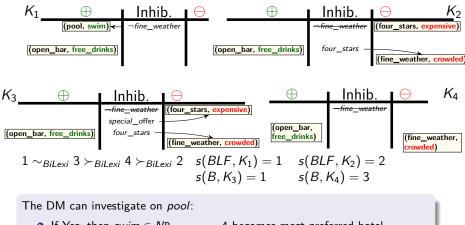
- "What most important goal could be necessarily realized
  - by adding only one formula  $\varphi$  to K
  - s.t. not possibly realized by adding  $\neg \varphi$  ?"
- "What is the simplest formula  $\varphi$  that could do that?"

#### Definition

Given a BLF  $(\mathcal{P}, \mathcal{R}, pol, \preceq)$  and K, a best-discriminating formula is:

$$\varphi^* = \operatorname*{arg\,max}_{\varphi \in \mathscr{L}_F} \left\{ k : \left\{ \begin{array}{l} \mathit{level}(g) = k \textit{ and} \\ g \in \mathit{NR}_{\mathcal{K} \cup \{\varphi\}} \textit{ and} \\ g \notin \mathit{\PiR}_{\mathcal{K} \cup \{\neg\varphi\}} \end{array} \right\} \right\}$$

### Example with 4 hotels



- If Yes, then  $swim \in NR_{K_4 \cup \{pool\}}$ , 4 becomes most preferred hotel
- otherwise swim ∉ ΠR<sub>K4∪{¬pool}</sub>

# Conclusions and Perspectives

#### Conclusions

- BLF = visual tool for decision making
- Use potential-BLFs to refine comparison between candidates
- potential-BLFs integrates what could additionally be learned about the candidates.

#### Perspectives

- Enhance expressiveness by adding supports and weights.
- Take into account uncertainty on the features of candidates.