

Preference Handling: (a decision analysis perspective)

Alexis Tsoukiàs

LAMSADE - CNRS, Université Paris-Dauphine
tsoukias@lamsade.dauphine.fr
<http://www.lamsade.dauphine.fr/~tsoukias>

Outline

- 1 Problem Setting
- 2 Basics
- 3 Preference Learning
- 4 Preference Modeling
- 5 Preference Aggregation
- 6 Using Preferences
- 7 Critical Questions

Preferences

- Preferences are “rational” desires.
- Preferences are at the basis of any decision aiding activity.
- There are no decisions without preferences.
- Preferences, Values, Objectives, Desires, Utilities, Beliefs,
...

Decision Aiding

A client

An analyst

A problem situation $\langle \mathcal{A}, \mathcal{O}, \mathcal{S} \rangle$
A problem formulation $\langle \mathbb{A}, \mathbb{V}, \Pi \rangle$
An evaluation model $\langle A, D, E, H, U, R \rangle$
A final recommendation

What are the problems?

- How to learn preferences?
- How to model preferences?
- How to aggregate preferences?
- How to use preferences for recommending?

Basic information

- A*: a set of alternatives (enumerative, combinatorial, product space ...)
- D*: a set of dimensions (attributes) describing *A*.
- E*: the “scales” used for the attributes in *D*.
- H*: the set of criteria.
- U*: uncertainties
- R*: algorithms, procedures, protocols etc ...

Binary relations

- \succeq : binary relation on a set (A).
- $\succeq \subseteq A \times A$ or $A \times P \cup P \times A$.
- \succeq is reflexive.

What is that?

If $x \succeq y$ stands for x is at least as good as y , then the asymmetric part of \succeq ($x \succeq y \wedge \neg(y \succeq x)$) stands for strict preference. The symmetric part stands for indifference (\sim : $x \succeq y \wedge y \succeq x$) or incomparability ($?$: $\neg(x \succeq y) \wedge \neg(y \succeq x)$).

Numbers

$$x \succeq y \Leftrightarrow \Phi(x, y) \geq 0$$

where:

$\Phi : A \times A \mapsto \mathbb{R}$. Simple case $\Phi(x, y) = f(x) - f(y)$; $f : A \mapsto \mathbb{R}$

N.B.

Likelihoods can also be expressed under form of binary relations and their numerical representations ($\omega_1 \succeq \omega_2$: event 1 is likely to occur at least as much as event 2).

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Consider sentences of the type:

- I like red shoes.
- I do not like brown sugar.
- I prefer Obama to McCain.
- I do not want tea with milk.
- Cost is more important than safety.
- I prefer flying to Athens than having a suite at Istanbul.

What do we learn out of such sentences?

- Basic hypotheses about the structure of the evaluation model.
- Binary relations.
- Numerical values (exact or imprecise).
- Importance Parameters.
- Inconsistencies.

Preference Structures

Independently from the nature of the set A (enumerated, combinatorial etc.), consider $x, y \in A$ as whole elements. Then:

If \succsim is a weak order then:

\succ is a strict partial order, \sim is an equivalence relation and $?$ is empty.

If \succsim is an interval order then:

\succ is a partial order of dimension two, \sim is not transitive and $?$ is empty.

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What characterises such structures?

Characteristic Properties

Weak Orders are complete and transitive relations.

Interval Orders are complete and Ferrers relations.

Numerical Representations

w.o. $\Leftrightarrow \exists f : A \mapsto \mathbb{R} : x \succeq y \Leftrightarrow f(x) \geq f(y)$

i.o. $\Leftrightarrow \exists f, g : A \mapsto \mathbb{R} ; f(x) > g(x) : x \succeq y \Leftrightarrow f(x) \geq g(y)$

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What if A is multi-attribute described?

$$x = \langle x_1 \cdots x_n \rangle \quad y = \langle y_1 \cdots y_n \rangle$$

$$x \succeq y \Leftrightarrow \Phi([u_1(x_1) \cdots u_n(x_n)], [u_1(y_1) \cdots u_n(y_n)]) \geq 0$$

A special case is when Φ is increasing to its first n arguments and decreasing to the following n arguments: it then can be an additive function.

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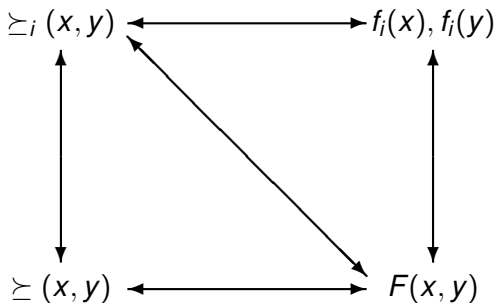
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The Problem

Suppose we have n preference relations $\succsim_1 \cdots \succsim_n$ on the set A . We are looking for an overall preference relation \succsim on A “representing” the different preferences.



Social choice approach

$x \succeq y$ **iff** it is the case for some majority rule among the criteria

A specific example:

$$x \succeq y \Leftrightarrow C(x, y) \wedge \neg D(x, y)$$

where:

- $C(x, y)$: a weighted majority rule;
- $D(x, y)$: veto condition

The goof and the bad news

Advantages

It applies always ... (almost)

Disadvantages

It does not turn always a useful result ...

It is not compact ...

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Value functions approach

Make out of the \succeq_i some value functions $u_i : A \mapsto \mathbb{R}$ in such a way that:

- $u_i(x)$ makes sense (you can compare it to $u_i(y)$).
- $u_i(x) - u_i(y)$ makes sense (you can compare it to $u_i(z) - u_i(w)$).

Then:

$$x \succeq y \Leftrightarrow \sum_i u_i(x) \geq \sum_i u_i(y)$$

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It is compact.

It always give a clear result

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It does not apply always (independence, commensurability, compensation).

If it applies it is expensive to get the information.

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What happens after aggregating preferences?

Suppose you use a majority rule in order to aggregate the \succeq_i in a single \succeq .

Then \succeq is just a reflexive binary relation and no other properties can be guaranteed to hold: IT IS NOT AN ORDER

You have to do something in order to construct an “ordering relation” \succcurlyeq out of \succeq .

Vast choice of procedures more or less axiomatised

Critical Questions

- 1 Am I solving the right problem?
- 2 Am I asking the right questions (and getting the right answers)?
- 3 Do I know exactly what I am doing?
- 4 Is it easy to implement?

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