

# Choice models: from linear option spaces to sets of horse lotteries

Gert de Cooman and Jasper De Bock

FLip, Ghent University, Belgium

FACULTY OF ENGINEERING AND ARCHITECTURE



## Choosing between options

We consider a subject's **choices** between **options** in a set, modelled by a **rejection function**:

$$R(\{\text{🍷, 🍷, 🍷, 🍷}\}) = \{\text{🍷, 🍷}\} \rightarrow \text{rejected options from the set } \{\text{🍷, 🍷, 🍷, 🍷}\}$$

**Essential aspects:**

- **incomparability**: more than one option may remain unrejected.
- **binary choice is only a special case**:  $R(\{\text{🍷, 🍷}\}) = \{\text{🍷}\}$ .

## Modelling uncertainty

To model a subject's **uncertainty** about the unknown value of some variable  $X$  in a set  $\mathcal{X}$ :

let her choose between rewards that depend on the value of  $X$ .

The subject now chooses between **uncertain rewards**  $o(X)$ :

option  $o: \mathcal{X} \rightarrow \mathcal{R}$  (finite set of rewards  $\mathcal{R}$ )

$$R(\{o_1(X), \dots, o_n(X)\}) = ?$$

Recent work by Van Camp (2017) en De Bock and De Cooman (2018, 2019) has led to general **representation** and **conservative inference** theorems for choice on abstract **ordered linear spaces** of options.

**Why work with general ordered linear option spaces?**

- **mathematical convenience**: linearity less cumbersome than convexity
- **modelling indifference**: options are affine subspaces
- **modelling infinite exchangeability**: spaces of Bernstein polynomials
- **non-standard orderings**: quantum mechanics, ...

To ensure that there are enough options for the subject to choose between, we **randomise** them, so take all their **convex mixtures**:

let her choose between **lotteries** that depend on the value of  $X$ .

The subject now chooses between **horse lotteries**  $H(X)$ :

horse lottery  $H: \mathcal{X} \rightarrow \Delta(\mathcal{R})$  (set of all mass functions on  $\mathcal{R}$ )

$$R(\{H_1(X), \dots, H_n(X)\}) = ?$$

## Options in a linear space

## Horse lotteries as options

## How to connect the two?

### Abstract options

- an ordered linear space of **options**  $\mathcal{V}$
- the set of all **finite option sets**  $\mathcal{Q}(\mathcal{V})$
- a **rejection function**  $R: \mathcal{Q}(\mathcal{V}) \rightarrow \mathcal{Q}(\mathcal{V}): A \mapsto R(A)$

The corresponding **set of desirable option sets**

$$K := \{A - u: u \in R(A \cup \{u\}), u \in \mathcal{V}, A \in \mathcal{Q}(\mathcal{V})\}$$

is the set of all option sets  $B$  such that 0 is rejected from  $B \cup \{0\}$ .

De Bock and De Cooman (2018, 2019) have proved many representation and inference results for such  $K$  that are **coherent**, **mixing**, **total**, or **Archimedean**.

### Connection

Consider the linear option space

$$\mathcal{D} := \text{span}(\mathcal{H} - \mathcal{H}) = \{\lambda(H - G): \lambda > 0, H, G \in \mathcal{H}\}.$$

When we begin with an  $R^*$  on  $\mathcal{H}$ , we let, up to scaling:

$$K_{R^*} := \{A^* - H: A^* \in \mathcal{Q}^*, H \in \mathcal{H}, H \in R^*(A^* \cup \{H\})\}.$$

When we begin with a  $K$  on  $\mathcal{D}$ , we let:

$$R_K^*(\emptyset) := \emptyset \text{ and } H \in R_K^*(A^* \cup \{H\}) \text{ when } A^* - H \in K, \text{ for all } A^* \in \mathcal{Q}^* \text{ and } H \in \mathcal{H}.$$

### Horse lotteries

- the set of all **horse lotteries**  $\mathcal{H}$
- the set of all **finite option sets**  $\mathcal{Q}^*$

A **rejection function**  $R^*: \mathcal{Q}^* \rightarrow \mathcal{Q}^*: A^* \mapsto R^*(A^*)$  on horse lotteries is called **total** if it is **coherent** and also satisfies

$$R_T^*. \frac{H_1 + H_2}{2} \in R^*(\{H_1, \frac{H_1 + H_2}{2}, H_2\}) \text{ for all } H_1, H_2 \in \mathcal{H} \text{ such that } H_1 \neq H_2.$$

It is called **mixing** if it is **coherent** and also satisfies

$$R_M^*. \text{ if } A^* \subseteq B^* \subseteq \text{conv}(A^*) \text{ then } R(B^*) \cap A^* \subseteq R(A^*), \text{ for all } A^*, B^* \in \mathcal{Q}^*.$$

## Connection theorems

**Theorem (Isomorphism).** Consider any coherent rejection function  $R^*$  on  $\mathcal{H}$  and any coherent set of desirable option sets  $K$  on  $\mathcal{D}$ . Then  $K = K_{R^*} \Leftrightarrow R^* = R_K^*$ .

**Theorem (Preservation of properties).** Let  $K$  be any set of desirable option sets on  $\mathcal{D}$ , and let  $R^*$  be any rejection function on  $\mathcal{H}$ .

- if  $K$  is **coherent**, then so is  $R_K^*$ ; and if  $R^*$  is **coherent**, then so is  $K_{R^*}$ ;
- if  $K$  is **total**, then so is  $R_K^*$ ; and if  $R^*$  is **total**, then so is  $K_{R^*}$ ;
- if  $K$  is **mixing**, then so is  $R_K^*$ ; and if  $R^*$  is **mixing**, then so is  $K_{R^*}$ .

**Theorem (Preservation of infima).** (i) Let  $K_i, i \in I$  be an arbitrary non-empty family of sets of desirable option sets on  $\mathcal{D}$ , and let  $K := \bigcap_{i \in I} K_i$  be its intersection. Then  $R_K^* = \bigcap_{i \in I} R_{K_i}^*$ .

(ii) Let  $R_i^*, i \in I$  be an arbitrary non-empty family of **coherent** rejection functions on  $\mathcal{H}$ , and let  $R^* := \bigcap_{i \in I} R_i^*$  be its infimum. Then  $K_{R^*} = \bigcap_{i \in I} K_{R_i^*}$ .

## Representation theorems

**Theorem (Representation for coherence).** A rejection function on horse lotteries  $R^*$  is **coherent** if and only if it is the intersection of some non-empty collection of **coherent binary** rejection functions. The largest such collection is the set of all **coherent binary** rejection functions that dominate it.

**Theorem (M-admissibility).** A rejection function on horse lotteries  $R^*$  is **total** if and only if it is the intersection of some non-empty collection of **total binary** rejection functions. The largest such collection is the set of all **total binary** rejection functions that dominate it.

**Theorem (E-admissibility).** A rejection function on horse lotteries  $R^*$  is **mixing** (and **Archimedean**) if and only if it is the intersection of some non-empty (closed) collection of **mixing** (and **Archimedean**) **binary** rejection functions. The largest such collection is the set of all **mixing** (and **Archimedean**) **binary** rejection functions that dominate it.

## Inference methods

Coherence, totality and mixingness are **preserved under** taking arbitrary non-empty **intersections**.

For each of these notions:

- **consistency**
- **inferential closure**
- **conservative inference** (natural extension)

The binary models serve as the (dually) **atomic**—complete?—ones:

- intersection of **comparable** binary models leads to binary models
- intersection of **incomparable** binary models leads to non-binary models

The representation theorems can be seen as **soundness and completeness results** for (semantics of) these logics, defined by the (implicit) inference rules in the coherence, totality and mixingness definitions.