



Innovative Applications of O.R.

## Using a multi-criteria decision aid methodology to implement sustainable development principles within an organization

Myriam Merad<sup>a,\*</sup>, Nicolas Dechy<sup>a,1</sup>, Lisa Serir<sup>b</sup>, Michel Grabisch<sup>c</sup>, Frédéric Marcel<sup>a</sup>

<sup>a</sup> INERIS-BP 2, F60550 Verneuil-en-Halatte, France

<sup>b</sup> Département Automatique et Systèmes Micro-Mécatroniques, TEMIS, 24 r Alain Savary, F-25000 Besançon, France

<sup>c</sup> Centre d'Économie de la Sorbonne, 106-112, Bd de l'Hôpital, 75013 Paris, France

### ARTICLE INFO

#### Article history:

Received 15 June 2010

Accepted 27 August 2012

Available online 10 September 2012

#### Keywords:

Sustainable development indicators  
Sustainable development action plan  
Multi-criteria decision aid  
ELECTRE and Choquet integral

### ABSTRACT

The implementation of Sustainable Development (SD) within an Organization is a difficult task. This is due to the fact that it is difficult to deal with conflicting and incommensurable aspects such as environmental, economic and social dimensions. In this paper we have used a Multi-Criteria Decision Aid (MCDA) methodology to cope with these difficulties. MCDA methodology offers the opportunity to avoid monetary valuation of the different dimensions of the SD. These dimensions are not substitutable for one another and all have a role to play. There is an abundance of possible aggregation procedures in MCDA methodology. In this paper we have proposed an innovative method to choose a suitable aggregation procedure for SD problems. Real life case studies of the implementation of an outranking approach (i.e., ELECTRE) and of a mono-criterion synthesis approach (i.e., MAUT approaches based on the Choquet integral) were done to respectively rank 22 SD strategic actions within an expertise Institute and rank 20 practical operational actions to control energy consumption of the Institute's buildings.

© 2012 Elsevier B.V. All rights reserved.

## 1. Introduction

Sustainable Development (SD) within an Organization can be achieved by Corporate Social Responsibility (CSR). In France, CSR is denoted by *Responsabilité Sociétale des Organisations (RSO)* – *Organization Societal Responsibility (OSR)* and aims to find an equilibrium between economic, social and environmental considerations. With all these considerations, the management of the Organization is becoming more and more complex due to the increasing number of: (i) regulations to fulfill, (ii) other actors that are impacted by the decisions of the Organization who must be consulted and (iii) indicators (parameters or criteria) to follow.

As it has been commonly stated in classical economic and management theories, firms need to make profits in order to survive. However, management needs to adopt a *viable* posture in the face of a variable environment. This new vision promoted by the SD principle has changed the way profit, costs and risks are considered. Indeed, profit is not only financial quantification (e.g. euro), but also represents social and environmental gains (e.g. more diversity within the organization and less pollution). The SD principle needs a strong political engagement because of the constant need to seek equilibrium between economic,

environmental and social concerns (see Fig. 1) that cannot be obtained without the implementation of a participative governance model.

To move from an ethical perspective of operation to an action, the SD principle requires methods and tools to be implemented. Multi-criteria decision aid methodology can help practitioners to deal with the expectations and perceptions of different actors with varied objectives to fulfill (economic, social and environmental). Our paper will focus on the contribution of multi-criteria decision aid methodology in outlining SD problems within the Organization and structuring recommendations for different actors inside and/or outside the Organization. We will also discuss various tools (aggregation procedures) that can be achieved in various contexts. We will cover these topics by discussing the use of multi-criteria decision aid methodology for the implementation of SD principles in a Public Organization whose mission is to prevent industrial and environmental hazards.

## 2. Multi-criteria decision aid methodology for the implementation of the SD principle within the Organization

To reach a sustainable development following the SD principle, the Organization should constantly seek for equilibrium (to reduce risks and increase benefits) with respect to interactions within its external environment (Fig. 2a).

\* Corresponding author. Tel.: +33 (0) 3 44 55 69 25.

E-mail address: [myriam.merad@ineris.fr](mailto:myriam.merad@ineris.fr) (M. Merad).

<sup>1</sup> The author was at INERIS during the study and is now working at IRSN.

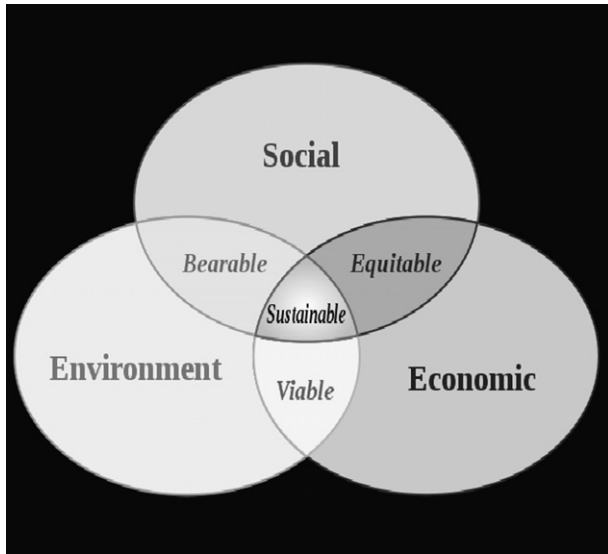


Fig. 1. Sustainable development principle.

2.1. SD and the different level of decision with the Organization

Different actions can be taken at different levels of decision-making within the Organization. These levels (Fig. 2b) are differentiated according to: (i) the practical objectives that are sought, (ii) the nature and the level of information/knowledge that is available and (iii) the potential impacts:

- The *strategical level*. At this level, the objective of decision-making is action planning. The decision is a long term decision (more than 8 years) and is dominated by both political and regulatory dimensions. At this level, the information is abundant but imprecise and difficult to sort and select.
- The *tactical level*. The decisions/actions are less influenced by political and regulatory dimensions than at the strategical level. The decision is a middle term one (4 years). At this level, the decisions are under the constraints and objectives within the Organization (social, technical and economic). This level is represented by the intermediate staff of management.
- The *operational level*. Decision-making pertains to short-term goals achieved in less than 1 year. The decisions made are more concrete involving technical information which is often specialized, precise, and more specific than the higher levels.

For each level of decision, the SD principle makes the decision maker reach for an equilibrium between economic, social and environmental concerns (risks/costs, benefits). The difficulty here is to both (i) clarify what measures (actions) must be taken at each level of decision-making and (ii) consolidate all the measures at each level in order to become a Societal Responsible Organization (SRO). In order to go beyond these limits, we have chosen to use a multi-criteria decision aid methodology. The methodology is based on a two-step approach. The first step consists in “outlining and structuring the problem”. To do so, it is necessary to identify and explicit the stakes, the constraints, the actors and stakeholders concerned or affected by the SD problematic and then to choose the adequate method according to the level and to the nature of information and knowledge. The second step is the “implementation of a method”. This step consists in restructuring the available information according to the method to be used and analyzing the results of the method in order to provide the adequate recommendation to the decision-maker. The Fig. 3 describes these two steps.

The problematic of “Description and structuring” (Fig. 3, point 2) in decision sciences is a challenging problem. We have chosen to use an Organizational Analysis (OA) technique crossed with a “contextual diagnostic” to describe the SD problem (Merad, 2010). These two techniques are imported from social sciences and help to make explicit what is at stake and what are the rationale between actors inside and/or outside the Organization.

Once the context is described, the analyst should move to a prescriptive model (Fig. 3, point 3). MCDA is an interesting methodology that can help the Decision Maker (DM) in respecting the accountability principle that is a challenging aspect when dealing with sustainable development.

2.2. Multi-criteria decision aid methods: general principles

The great majority of decision aid methods tend to structure the decisional aid process into three principal phases: *formulation of decision-aid problematic, exploitation, and recommendations* (Fig. 4). Formulating a decision-making problem consists in finding an *adequate model for the decision-making process*. In a context where reality is represented by a multi-criteria form, this first phase consists of:

- Describing the decision making context and process. This requires the identification of the actors, their value systems and the different significant points that affect the decision making process which can vary in time.
- Defining the actions that are elements of decision-making.

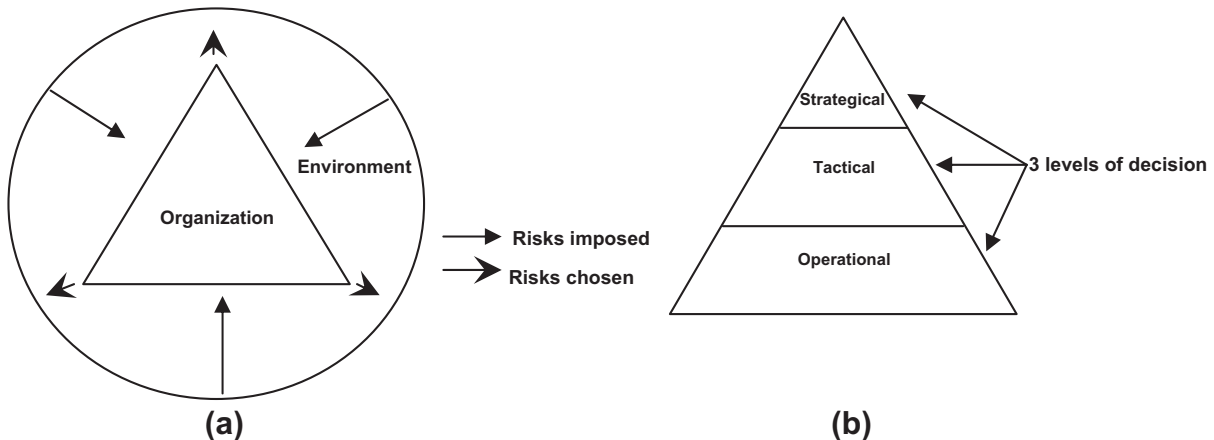


Fig. 2. The Organization and its environment (a) and three levels of decision in the Organization (b).

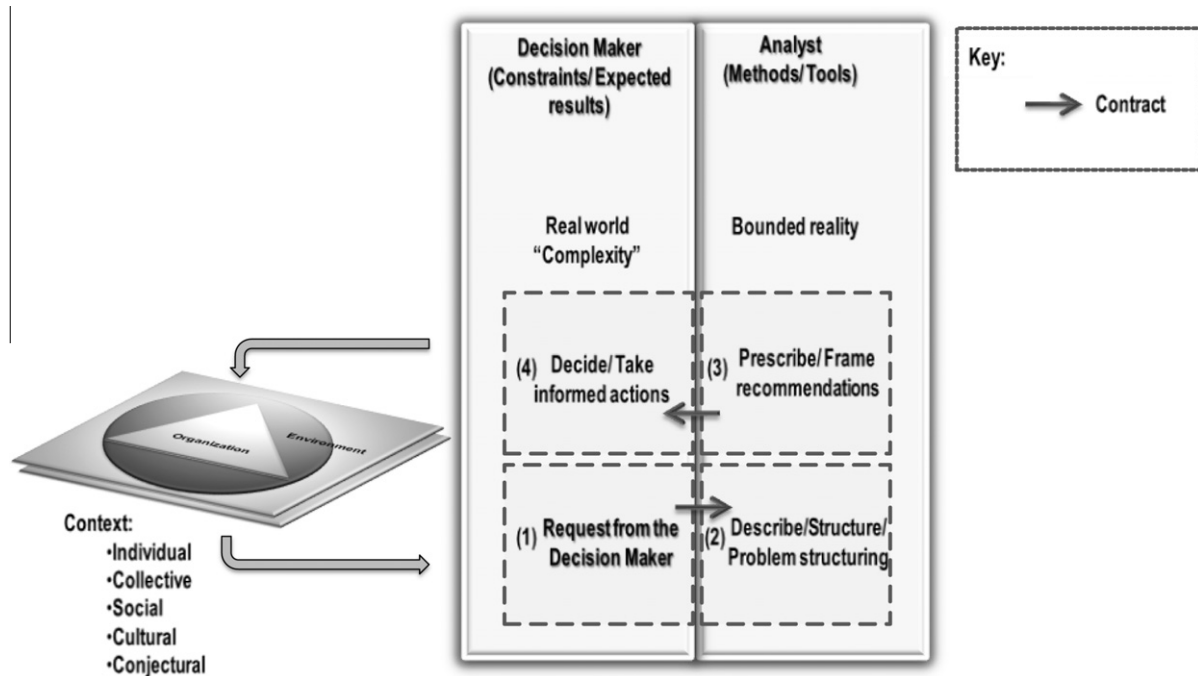


Fig. 3. Multi-criteria decision aid methodology: the link between the analyst and the decision maker.

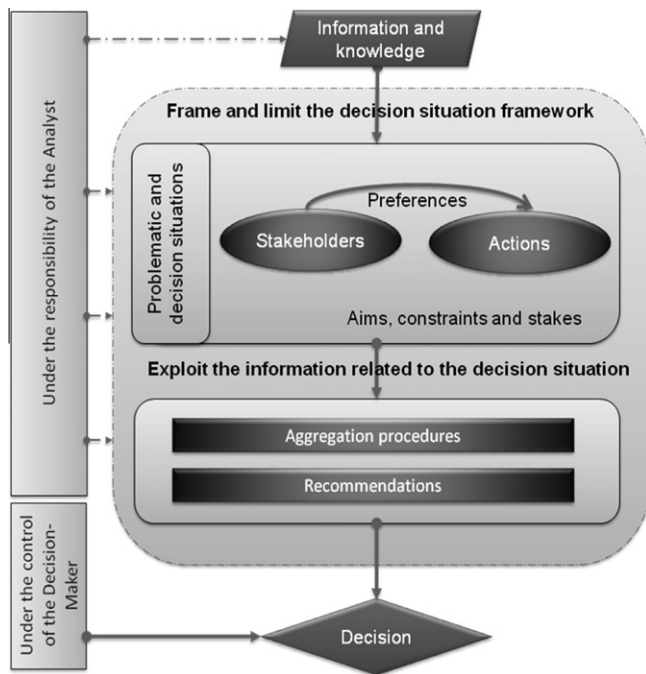


Fig. 4. Multi-criteria decision aid method applied to the implementation of the SD principle.

- Identifying decision making situations which consists of looking at how the recommendation or the results should be presented (e.g., is the aim behind SD methodological or procedural with an intention to be repeated?); and identifying the spirit in which the decision aid process was designed.
- Defining a set of criteria and a set of indicators and modeling the consequences of actions and drawing up criteria in order to compare the different actions with each other.

This first phase is undoubtedly the most delicate one because the conclusions reached and the recommendations provided

depend on the way in which the SD principle is considered. The second phase is more mathematical. The so-called operational phase consists of defining or choosing an “aggregation procedure” for the available information for each action with the aim of reaching an overall conclusion (recommendation) that will serve to lend support to the decision.

### 2.3. From a partial evaluation to an global evaluation: aggregation

Aggregating the evaluations of an action  $x$  taking into account the evaluations of the different criterion  $g_j$  and opinions on the importance that each player gives the F criteria is also a way of asking the question of *compensation* levels that one wishes to obtain between the criteria (Vincke, 1986). For every multi-criteria decision aid method there is a choice made of the kind of logic applied:

- *Compensatory*. The most well known example is the case of a weighted sum. Consequently the aggregation methods found in this category range derive from the postulate that it is possible to compare, in an absolute manner, the various evaluations of an action  $x$ . Consequently a high evaluation of one criterion  $g_{j1}$  ( $g$  is the criteria function) will compensate for a lower evaluation of another criterion  $g_{j2}$ .
- *Partially-compensatory*. A certain level of compensation is acceptable.
- *Non-compensatory*. Applying these kinds of methods, the evaluations of an action  $x$  based on criteria  $g_j$  are not mutually compensatory.

Furthermore, there are several aggregation procedures that can be gathered into three categories, each relating to an *operational approach to performance aggregation* (Roy and Bouyssou, 1992):

- Using a *single summary criterion*. This comprises summarizing the criteria family into a single criterion. In this approach incomparability is ruled out (see Roy and Bouyssou, 1992).
- By *upgrading the summary*. This comprises moving from a comparison relationship drawn up for each criterion to a global comparison relationship. This approach accepts incomparability.

- By reaching an interactive local judgment with trial and error iterations. If in the other two approaches the rules are set out to provide an exhaustive summary response, this is not the case here. This is because aggregating is the result of a sequence of local judgments.

### 3. Which aggregation procedures should be chosen for the implementation of the SD principle?

When facing the decisional problem that consists in the implementation of the SD principle, actors are brought to discriminate and/or choose between various options/actions/projects whose consequences are often badly controlled insofar as they are confronted with complex problems with multiple dimensions and whose stakes are often of big importance.

Looking at the literature about the use of Multi-Criteria Aggregating Procedure (MCAP) in the implementation of SD principles, we came to the following remarks:

- There is not a lot of research and work that has been done on the implementation of the use of MCAP to the implementation of the SD principle (Fauchaux et al., 1998).
- MCAP is mainly applied as regards environmental management problems (Janssen, 1992; Munda, 1995; Paruccini, 1994) mainly in Canada (Chevallier, 1999) and in Switzerland (Maystre et al., 1994; Maystre and Bollinger, 1999).
- Methods such as ELECTRE (Hokkanen and Salminen, 1997; Kangas et al., 2001; Hokkanen et al., 1998), PROMETHEE (Behzadian et al., 2010; Hokkanen and Salminen, 1997), and AHP (Rezaei-moghaddam and Karami, 2008; Ramanathan and Ganesh, 1995; Girard and De toro, 2007) are largely applied to environmental management problems. The paper by Kowalski et al. (2009) provides an interesting synthesis of the methods applied to the energy management problems.
- We found only one document giving applications at the level of an Organization (company) (Omann, 2004). The case study presented is about how to obtain a sustainable Product Service Systems and the method used is based on MACBETH.
- Let us notice that the majority of studies published are generally at a national scale. The application of the SD principle within an Organization (e.g. company, plant, etc.) is largely different from a territory (e.g. national, regional, etc.) mainly because of the number of DMs: one main in the case of the Organization (e.g. the General director), and several when dealing with territories (e.g. Mayors, all the general directors of the Organizations within the territory, local administrative authorities, etc.). It is also different because a territory is an open system (where coexist different levels of responsibility in terms of decisions and where the borders of what is *in* and what is *out* is not delimited legally speaking) and the Organization a more closed one (Merad, 2010).

According to these observations, we have considered as central to try to elaborate some recommendations on the use of MCAP for the implementation of SD principle within an Organization. We have previously stressed the necessity to consider the fact that different levels of concern (levels of decision) coexist in the same Organization. We argue that for each level of concern, there is a set of characteristics that do constrain the decision aid process. These constraints can help us to make a choice between the different multi-criteria aggregating procedures (MCAPs) used, also considering that each MCAP must respect specific assumptions and postulates. In a more generic way, Guitouni and Martel (1998) have proposed seven *key questions* to choose an MCAP. These general questions are useful for global decision-making contexts. In a more specific context, De montis et al. (2003), De montis et al.

(2004), and Omann (2004) have proposed respectively a set of quality criteria and a set of questions to respectively evaluate or choose MCDA methods when implementing the SD principle.

In our case, we wanted to propose a method to choose a MCAP when implementing the SD principle within an Organization. Based on the different papers listed above and the work done by Merad et al. (2004) and Merad (2010), we have proposed that the implementation of the SD principle within an Organization can lead to two major categories of problems:

- **Category A** “A need to debate and initiate a dialog between actors about the way to make SD principle move from philosophical concept to pragmatic and operational tool”. The objective is to build a common representation of the boundary of the application of the SD principle and to rationalize the involvement and the investment in SD actions that will be done and will have an impact on both the tactical and the operational level within the Organization. In this category of problem the information is more qualitative and the actors involved are those that belong to the strategic and the tactical levels of decision (Fig. 2). As example: the implementation of the ISO 26000 norm about Corporal Social Responsibility.
- **Category B** “A need to rationalize the implementation of SD actions”. In this category, the information is more quantitative and the actors involved are those of the operational level of decision (Fig. 2). As example: the implementation of a Displacement Action Plan to reduce CO<sub>2</sub> emission.

This prophylaxis based on two categories leads us to suggest some conditions on the use of MCAP for the implementation of the SD principle within an Organization:

- **Category A.** We suggest using MCAPs based on:
  - MCAPs that are non- or only partially-compensatory such as summary upgrades.
  - Preference structures (see Roy and Bouyssou, 1992) of types (S,R) seem of interest to us because the incomparability relation R invites the actors to question themselves on their representation of the problem, on the relevance of the set of criteria used, etc.
  - Using information that is both quantitative and qualitative.
  - The ability to let the different opinions of the actors and actors involved be explicitly expressed.
- **Category B.** We suggest using MCAPs based on:
  - Single summary criterion type PMCA.
  - Preference structures (see Roy and Bouyssou, 1992) of types (I,P) or even (I,P,Q) seem of interest to us. Given the strong tendency of operational actors to ask for precise data and concise conclusions, the incomparability relationship R is not seen as an invitation to debate, but a problem blamed on the method.

Hereafter, we will give an illustration on the use of the multi-criteria decision aid methodology focusing on the prescriptive phase (Fig. 3) of the decision aid process. The illustration is the implementation of a Sustainable Development Plan (SDP) in a public institute of expertise. The results of the implementation of the descriptive phase are presented on the papers by Merad (2010).

Two MCAPs were chosen based of these two categories:

- ELECTRE III (see Roy and Bouyssou, 1992) to rank a set of SD actions. This MCAP offers the possibility of dealing with both qualitative and quantitative information and deals with the preference of a large variety of stakeholders with different backgrounds and constraints. The Problem of ranking a set of SD actions is a decision problem done at a strategical level of the



**Table 1**  
List of 22 SD actions for INERIS.

Id.	Description	SD domains		
		Environmental	Social	Economic
1	Office automation: for 2010, 60% of the newly bought materials must have performance equivalent to the TCO Swedish reference, and comprise a minimum percentage of recycled materials	✓		
2	To increase the percentage of products coming from biological agriculture in the collective restoration services	✓	✓	
3	To check the sources of origin of wooden products	✓	✓	
4	To use eco-labeled products for building cleaning	✓		
5	To control the use of paper	✓		
6	To inform and raise awareness among the staff about eco-driving during work displacements	✓		
7	To only have vehicles (private cars) with less than 130 gram of CO <sub>2</sub> /kilometer	✓		
8	To implement a company displacement plan	✓		
9	To control waste management	✓		
10	To have a reasonable management of parks and of the <i>arborical</i> patrimony within the Institute	✓		
11	To remove ink-jet printers for 2010	✓		
12	To control energy consumption of institute buildings	✓		
13	To implement durable policy of sourcing			✓
14	To contribute to the development of a solidarity social economy		✓	✓
15	To consolidate the partnerships with the different actors of the SD		✓	
16	To develop new managerial practices with respect to SD principles		✓	
17	To develop better career management and to improve the well being in the Institute		✓	
18	To invest the Institute in the social responsibility by taking care of our responsibility in handicap integration		✓	
19	To implement a strategic watch in the field of SD to support project leaders and managers within the Institute		✓	✓
20	To develop the exchanges of knowledge and know-how with our foreign partners and to capitalize the good practices		✓	
21	To reinforce the links between INERIS and NGOs		✓	
22	To develop a SD culture within the Institute		✓	

Organization. With ELECTRE III, we have the opportunity to use the preference structures of types (S,R). The S, R relations will help us in creating a deliberation context between stakeholders and discuss about the impact of the SD action plan (see category A).

- Choquet integral (Labreuche and Grabisch, 2006) to rank actions to control energy consumption of the Institute's buildings. The problem is an operational and practical problem. The stakeholders involved are specialists in this field that are able to give precise information and that expect an (I,P) preference structure (see category B).

#### 4. Example of the implementation of the SD principle in a Public Institute in the field of industrial environment and risks

INERIS is a public institute in the field of industrial environment and risks, and works as a technical support for the French ministry of environment. As a public institute, INERIS must be exemplary when it comes to the implementation of the SD principle. In 2008, INERIS signed, with other public organizations, the Sustainable Development Charter. This one reinforces the engagement of the Institute in favor of the SD principle. In a letter addressed to INERIS on April 6, 2009, the French Ministry of Environment invited the Institute to frame a Sustainable Development Plan (SDP). In this SDP, the Ministry asked to: identify some strategic objectives, list a set of actions respecting three priorities (responsible sourcing, eco-responsibility, social responsibility) and identify a set of indicators to follow the execution of the actions at an operational level.

Even if the SD principle has been known and defined since 1987 in the Brundtland report, it is quite innovative in the French public Organization to make explicit and rationalize a set of actions that will be followed each year, and contribute to SD, considering economic, social and environmental aspects. How can all the possible actions at INERIS be identified? How can we rank the actions from the most beneficial actions to the less beneficial ones?

In what follows, we have chosen to discuss the use of two methods to rationalize the SD principle.

##### 4.1. Use of ELECTRE III MCAP for the ranking of SD actions for all the Institute

Actions to implement SD principles within the INERIS Organization are those which contribute to achieve an accepted equilibrium between environmental, social and economic constraints. An organizational analysis was carried out within the Institute. This analysis, mainly based on investigations aiming at explicating the nature of the relations between actors and the inherent stakes that influence the sustainability of the Institute, has helped us to identify more than 48 actions proposed by the staff (Merad, 2010). These actions were reduced to 22 actions that respect the constraints made by the ministry of Environment. These actions are presented in the Table 1 below:

These actions are under the responsibility of the top management staff within the Institute. Each of them has a different role and perspective but share common tasks that consist of seeking a financial equilibrium of their Division and defining a strategical vision (see Category A, chapter 2).

##### 4.1.1. Set of criteria and weighting

These actions are coordinated by the General Director and his Advisory board (Staff of directors). Criteria were needed to be able to organize a discussion between the Board of Directors and compare one action to the other according to the different available points of view. Two sets of criteria were asked to be necessary: expected benefits due to the implementations of the SD actions and necessary expenses due to the implementations of the SD actions. The 22 SD actions are assessed according to the three criteria of benefits and three criteria of cost (expenses).

- (a) *Set of benefit criteria (see Fig. 5):* The 22 actions have all **positive impacts in terms of environmental, social and economic responsibility** that can be estimated qualitatively. After a debate with the Board of Directors, we have considered that it was possible to identify four levels for each criterion. Each action takes a value going from 1 (the impact is difficult to estimate or does not have impact) to 4 (high level of impact):

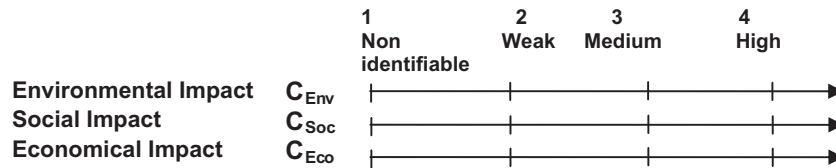
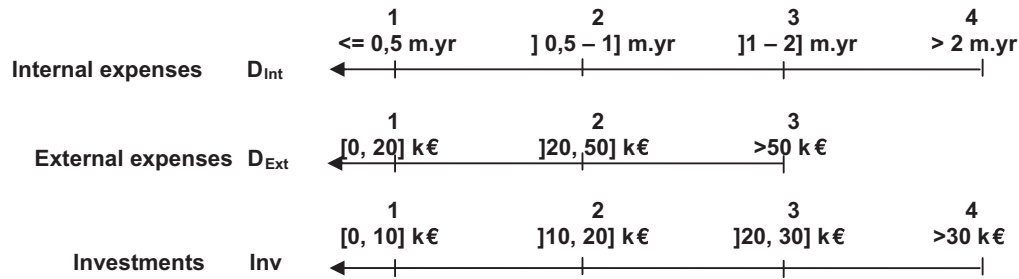


Fig. 5. Set of benefit criteria.



\* m.yr: Man/year

\* 1 k€ = 1000 euro.

Fig. 6. Set of cost criteria.

(b) *Set of expense (cost) criteria*: The implementation of the 22 actions will represent an expense for the Institute. As presented below, three criteria will be used to estimate the surplus of expenses involved for the implementation of the SD actions: **internal expenses** (work done by the Institute staff), **external expenses** (e.g., scientific and technical subcontracting) and **investments** (e.g., equipment). Each action takes a value going from 0 (not possible to assess), 1 (low level) to 4 (high level) for the two criteria “Internal expenses” and “Investments” and a value of 0 (not possible to assess), 1 (low level) to 3 (high level) for the criterion “External expenses”. To each level of the “External expenses” and the “Investments” criteria corresponds an interval in K€ (see Fig. 6). To each level of the “Internal expenses” criterion corresponds an interval estimated in man/year (see Fig. 6).

The choice of criteria-specific weightings has required the formalization of the opinion given by the staff of Directors. We have chosen to use the ‘cards method’ (Merad, 2002; Figueira and Roy, 2002) because this method is well-adapted to ELECTRE III and can help to frame a common representation of the SD strategic problem between the staff of directors. Each criterion is associated to a card and presented to the Directors that are asked to sort the cards from the least important to the most important criterion and to insert blank cards to indicate the relative importance among criteria from one rank to the next. This revised Simos method (Roy and Figueira, 1998) has many advantages, namely preventing criteria from being eliminated by a zero-weight assignment and incorporating the various weightings ascribed by Directors as a function of their expectations and preferences (Merad, 2002). This method was applied separately to obtain one weighting set to the benefit criteria and another weighting to the cost criteria (see Table 2). Each of the three benefit criteria has an equivalent weight in the choice of the priority between SD actions. The weight of the internal expenses ( $D_{Int}$ ) was considered to be equivalent to the weight of the investment (Inv). The weight of both the Inv and  $D_{Int}$  are strictly higher than the external expenses ( $D_{Ext}$ ).

#### 4.1.2. From a partial to a global assessment of the SD actions

At this level of decision (strategical and tactical) see Fig. 2b, most of the available information is qualitative. This is mostly due to the fact that there is a need to frame a common representation of strategical objective of the Institute once the actions are identified and the criteria specified. This problem belongs to the “category A” defined in chapter 2. The “category A” proposes a

**Table 2**  
Impacts SD dashboard.

Id. SD actions	Expected benefits			Expected costs		
	$C_{Env}$	$C_{Soc}$	$C_{Eco}$	$D_{Int}$	$D_{Ext}$	Inv
1	4	1	1	0	0	1
2	4	3	1	0	3	1
3	3	3	1	0	2	2
4	3	1	1	0	1	0
5	4	1	1	1	2	0
6	1	2	1	1	1	0
7	3	1	1	0	0	2
8	2	4	3	1	0	2
9	3	2	1	1	2	4
10	4	1	2	1	0	0
11	3	1	1	1	1	0
12	4	2	3	0	0	4
13	1	3	2	1	0	1
14	1	4	3	0	1	0
15	1	3	3	2	0	0
16	2	4	2	1	1	0
17	1	4	3	1	1	0
18	1	4	1	1	0	1
19	1	3	3	1	0	1
20	1	3	1	1	0	0
21	1	3	2	2	0	0
22	3	4	4	1	1	0
<i>Thresholds</i>						
$q$	1	1	1	1	1	1
$p$	1	1	1	1	1	1
Weights	100	100	100	62	38	62

**Table 3**  
Ranking of the actions according to two sets of criteria.

Final pre-order (Rank)	Priority order on actions according to benefit criteria	Priority order on actions according to cost criteria
1	22	14 and 4
2	12 and 8	10, 20 and 1
3	14, 2 and 17	11, 6, 16, 17 and 22
4	3 and 16	13, 18 and 19
5	9, 15 and 19	15, 21 and 7
6	10	5 and 8
7	1 and 5	12 and 2
8	13, 11, 4, 7 and 21	3
9	18	9
10	20	
11	6	

set of MCAP based on preference structures of types (S,R). The ELECTRE MCAPs (see Roy and Bouyssou, 1992) correspond to this category. The Institute is very familiar with ELECTRE methods and so we have decided to use ELECTRE III (see Merad et al., 2004).

By conducting a set of interviews within the staff of Directors, it was possible to fill out the SD actions dashboard. Each action is coordinated by a Director. Each Director gives an estimation of the SD action according to the two sets of criteria. These

assessments are carried out once per year and synthesized in “Impacts SD dashboard” and consolidated in a collegiate way.

Each action is compared to the others according to the set of criteria defined in the table below. After discussion with the staff of Directors we have been able to fix equivalence and preference thresholds for each qualitative criterion. The ELECTRE III method was run two times using the software ELECTRE III/V Version 3.1b for each set of criteria. Two credibility indices  $\sigma(a_i, a_j)$  and  $\sigma(a_j, a_i)$  are calculated each time for each pair of actions  $a_i$  and  $a_j$  of the 22 actions presented in Table 2. This calculation allows us to define an outranking relation between all the actions. It then became possible to draw up both a partial pre-order, that gives the possibility of having a situation of an in-comparison between two actions, and a final pre-order presented in Table 3.

This table has helped to start a debate between staff of Directors. Indeed, actions 5, 7, 8, 11, 12 and 21 were considered before explaining their preferences as the most important actions to be done to become an OSR. The great majority of these actions are eco-responsible actions which means that they are considered as having a principal impact on the environmental sphere. In fact, the interview done with internal and external actors has shown that the minimum set of actions that have to be done to apply the SD principle are the actions listed below. This is why the achievement of the objective fixed in the action 5 “To control the

**Table 4**  
List of 20 actions for building energy control at INERIS.

Id.	Description	Buildings					
		Building no. 3	Building no. 4	Building no. 5	Building no. 7	Building no. 10	Building no. 79
Ac.12-1	Insulation of the roof					✓	
Ac.12-2	Insulation of the roof	✓					
Ac.12-3	Insulation of the external walls					✓	
Ac.12-4	Insulation of the external walls	✓					
Ac.12-5	Replacement of the exterior wood finishings					✓	
Ac.12-6	Replacement of the exterior wood finishings				✓		
Ac.12-7	Installation of solar panels DHW <sup>a</sup>			✓			
Ac.12-8	Installation of solar panels DHW	✓					
Ac.12-9	Installation of an electric optimizer	✓					
Ac.12-10	Replacement of the bodies of adjustment	✓					
Ac.12-11	Replacement of the bodies of adjustment					✓	
Ac.12-12	Creation of a boiler room	✓					
Ac.12-13	Creation of a sub-station					✓	
Ac.12-14	Creation of a sub-station		✓				✓
Ac.12-15	Creation of a sub-station			✓			
Ac.12-16	Creation of a sub-station						✓
Ac.12-17	Installation of a recuperator of DHW				✓		
Ac.12-18	Installation of a recuperator of DHW					✓	
Ac.12-19	Installation of a CMV2F <sup>b</sup>					✓	
Ac.12-20	Installation of a CMV2F	✓					

<sup>a</sup> Domestic hot water.

<sup>b</sup> Controlled mechanical ventilation with double flow.

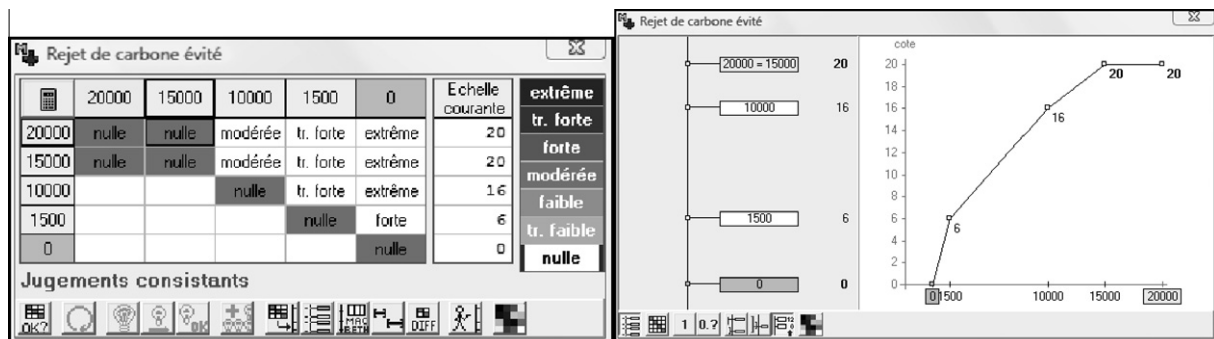


Fig. 7. Details on the procedure used to define utilities.

**Table 5**  
A partial assessment of the actions

	$u_{Eff}$	$u_{Energy}$	$u_{CO2}$	$u_H$	Global score given by the DM
Ac.12-1	4.5	0.26	0.95	0	2
Ac.12-2	4.5	0.92	1.73	0	2.25
Ac.12-3	9	5.12	9.59	20	11.5
Ac.12-4	9	6.57	7.84	15	11
Ac.12-5	18	6.94	8.05	7.50	12.25
Ac.12-6	18	4.70	9.15	15	12
Ac.12-7	18	20	14.02	17.5	16
Ac.12-8	18	20	5.13	20	17.75
Ac.12-9	9	3.93	20	15	11
Ac.12-10	9	8.99	9.17	11.25	10.25
Ac.12-11	9	9	13.63	11.25	10.75
Ac.12-12	4.5	9	20	7.50	11
Ac.12-13	16	9.01	13.63	15	13.75
Ac.12-14	16	9	13.08	15	13.75
Ac.12-15	16	9	8.81	15	12.75
Ac.12-16	16	8.99	9.15	15	13
Ac.12-17	18	20	8.94	20	19
Ac.12-18	18	20	2.40	20	17.5
Ac.12-19	18	12.80	4	11.25	14.75
Ac.12-20	18	12	4	7.50	14.5

**Table 6**  
Rankings on the 20 actions.

	Desired global assessment	LS	HLS
Ac.12-1	2	2.43	2.15
Ac.12-2	2.25	2.73	2.31
Ac.12-3	11.5	11.73	12.66
Ac.12-4	11	10.30	10.74
Ac.12-5	12.25	12.58	12.18
Ac.12-6	12	12.27	12.56
Ac.12-7	16	17.69	17.42
Ac.12-8	17.75	17.93	17.55
Ac.12-9	11	11.75	11.57
Ac.12-10	10.25	9.89	9.98
Ac.12-11	10.75	10.95	10.66
Ac.12-12	11	10.40	10.73
Ac.12-13	13.75	13.04	13.53
Ac.12-14	13.75	13.04	13.45
Ac.12-15	12.75	13.02	12.83
Ac.12-16	13	13.03	12.87
Ac.12-17	19	18.24	18.02
Ac.12-18	17.5	17.72	17.20
Ac.12-19	14.75	14.49	13.86
Ac.12-20	14.5	13.73	13.08

use of paper” was considered as an emblematic eco-responsible action for an Expertise Institution and is now considered in the calculation of the profit-sharing of the workers of the Institute. Action 8 “To implement a Company Displacement Plan” that is seen as one of the most beneficial actions (rank 2) needs investments. This action has been given overwhelming support by the French Government, who considers action 8 as an interesting strategy to reduce the CO<sub>2</sub> emissions during the home-to-work commute.

Action 14 that consists of the development of a solidarity social economy (e.g., provide services to the Institute workers like

caretaker’s lodge) was at first considered as insignificant, but the ranking has shown that this action does not need a lot of investment, and can have an important impact for working conditions within the Institute.

Action 12 “To control energy consumption of institute buildings” was considered as a leading 2008–2009 action for the implementation of the eco-responsibility principle. The “Facility Manager” in the Institute is in charge of the implementation of this action. The following section is an illustration of the MCAP chosen to deal with an operational problem.

4.2. Use of Choquet integral MCAP for the ranking of operational actions for the execution of the SD action 12 “To control energy consumption of institute buildings”

The Institute has launched a project for the rehabilitation of the inheritance built within the site of Verneuil (Picardy region in France) where a great part of the buildings are old (60 years or more). In 2008, an audit based on thermograph analysis has revealed that the buildings present an important thermal loss (between 150 and 500 Kilowatt/meter<sup>2</sup>). Thus the Institute must establish an energy control policy (action 12), regarding French thermal Regulation promulgated in 2005, that has an ambitious energy objective, by reducing more than 30% of the consumption due to the use of heating.

The actors involved in the implementation of action 12 are working at an operational level. They have heterogeneous quantitative information about different actions that they think are interesting to implement (Category B see section 1.3). They would like to set a priority order on a set of 20 actions (see Table 4) that they have previously been identified.

The Buildings nos. 3 and 10 are the most concerned by the implementation of SD action 12. An expert consulted within the Institute has noticed that due to the age, shape and high level of workers that work in these two buildings, they are at the first rank concerns of restoration.

Due to the fact that all the actions listed below cannot be implemented in the same year considering the fixed budget, it becomes necessary to give a decision aid support to the Division Manager in order to define a plan of works to be done, considering different points of view and criteria.

4.2.1. Set of attributes and partial assessment of the actions

Four criteria were identified by analyzing the audit report of 2008 and by considering experts’ opinions and the expectations of the final Decision Maker (DM) who is an expert in energy. These criteria (attributes) are both qualitative and quantitative:

- *Efficiency (Eff)*. Legitimacy of the work to be done by comparing the investment cost with respect to the effective gain resulting from the action (score from 1 to 4).
- *Energy saving (Energy)*. Estimation of percentage of the total energy saving (in %).
- *Carbon emission avoided (CO<sub>2</sub>)*. Estimation of the “equivalent carbon” avoided after the end of the work (in kg).

\* “Jugements consistants”: consistant judgments. \*\* “Rejet de carbone évité”: carbone rejection avoidance.

	<i>Eff</i>	<i>Energy</i>	<i>CO2</i>	<i>H</i>	<i>LS</i>	<i>Eff</i>	<i>Energy</i>	<i>CO2</i>	<i>P</i>	<i>HLMS</i>	<i>Eff</i>	<i>Energy</i>	<i>CO2</i>	<i>P</i>
<i>LS</i>	1.50	0.89	0.71	0.87	<i>Eff</i>	NA	0.23	-0.19	-0.29	<i>Eff</i>	NA	0.10	-0.18	-0.16
<i>HLS</i>	1.29	0.80	0.69	1.21	<i>Energy</i>		NA	0.08	0.05	<i>Energy</i>		NA	0.10	0.08
					<i>CO2</i>			NA	-0.08	<i>CO2</i>			NA	-0.08
					<i>P</i>				NA	<i>P</i>				NA

Fig. 8. Shapley values and interaction index’s matrices.



- *Hardness of the work (H)*. Considering the duration of the work, its scope and its impact on the activity of the employees, the DM attributes a score from 1 to 4.

The DM would like to obtain a global score on each action. The analyst has then decided to use Choquet integral where the final score is calculated going from partial utility assessment of the action on each criterion to a global utility function.

MACBETH methodology (Bana e costa et al., 2005) was used to determine the utility functions on each criterion. We first ask the DM to provide two significant levels for each criterion. For the criteria *Energy* and *CO<sub>2</sub>*, the DM considers the current situation unacceptable if there is no energy saving and if the avoided carbon emission is equal to 0 kg. A score equal to 1 for the criteria *H* and *Eff* are considered unacceptable. Then, the DM considers a score equal to 4 for the criteria *H* and *Eff* completely satisfactory, equivalent to respectively 30% economy saving and more than 15t of carbon emission avoided.

The analyst wanted to obtain a utility level between 0 and 20 because this range of information was meaningful for the DM (see Fig. 7). This way, the information about what is unacceptable and suitable on each criterion was quoted as following:  $u_{Eff}(1) = 0$   $u_{Eff}(4) = 20$ ;  $u_{Energy}(0) = 0$   $u_{Energy}(30) = 20$   $u_{CO2}(0) = 0$   $u_{CO2}(15,000) = 20$  and  $u_H(1) = 0$   $u_H(4) = 20$ .

The MACBETH procedure was used according to M\_MACBETH software. The DM was asked to express his preferences on each criterion among all the actions. The DM was also asked to provide a global score (see Table 5) on each action between 0 and 20. Although it was unrealistic to consider that this range of information can always be given, we have assumed that the DM was able to provide it (Table 6). This last information helps the Analyst in defining the expected results viewed by the DM.

Now that the utility functions are defined, the next steps consist of defining the parameters of the Choquet-like aggregation

function and of obtaining a ranking on the actions according to the Choquet integral. The identification method has been implemented within the Kappalab package (Grabisch et al., 2006) for the GNU R (Development core team, 2005) statistical system where actions are presented as vectors with their partial utility score on each criterion.

4.2.2. From a partial to a global assessment of the actions

The global utility function of any action *a* was given by the following:

$u(a) = F(u_{Eff}(a), u_{Energy}(a), u_{CO2}(a), u_H(a))$  where  $u_{Eff}(a)$ ,  $u_{Energy}(a)$ ,  $u_{CO2}(a)$  and  $u_H(a)$  were called the *utility functions* and *F*, non-decreasing in its arguments, was called the *aggregation function*.  $a_{Eff}$ ,  $a_{Energy}$ ,  $a_{CO2}$  and  $a_H$  were the scores (evaluations) given to each action over each criterion.


The overall utilities computed using the Choquet integral were presented in the table below where LS was calculated according to the least squares identification routine based on quadratic programming and HLS was based on the heuristic least squares identification routine.

The Shapley values of the solutions (the Shapley value of *i* can be thought of as an average value of the marginal contribution  $\mu(T \cup \{i\}) - \mu(T)$  of criterion *i* to a subset *T* not containing it) and the interaction index's matrices (see Fig. 8) are given in the following tables:

As one can see, both of the two solutions give the criterion *Eff* as the most important. In fact, the cost of an action must be justified. The criterion *CO<sub>2</sub>* is less important for both models. HLS gives the importance of criterion *H* in second position, slightly weaker than criterion *Eff*. On the contrary, the LS model gives quasi identical importance to *H* and *Energy*. This difference can be explained by the small amount of data.

Both models give rise to the three most important criteria. *CO<sub>2</sub>* does not seem to affect the global evaluation of an action.

**Table 7**  
Ranking of the 20 actions from the least important to the most important

	Id.	Buildings					
		Building n°3	Building n°4	Building n°5	Building n°7	Building n°10	Building n°79
Least important  Most important	Ac.12-1					✓	
	Ac.12-2	✓					
	Ac.12-10	✓					
	Ac.12-11					✓	
	Ac.12-12			✓			
	Ac.12-4	✓					
	Ac.12-9			✓			
	Ac.12-3					✓	
	Ac.12-6					✓	
	Ac.12-5	✓					
	Ac.12-15			✓			
	Ac.12-16						✓
	Ac.12-13					✓	
	Ac.12-14		✓				✓
	Ac.12-20	✓					
	Ac.12-19					✓	
	Ac.12-7				✓		
	Ac.12-18					✓	
	Ac.12-8			✓			
	Ac.12-17				✓		

Concerning the interactions, we can see that *Eff* and *Energy* are complementary, whereas *Eff* and *H* are redundant. The rest of the pairs are quasi-independent. According to these observations, we have finally explicated the global score  $e$  of an action  $a$  in the case of a 2-additive capacity where the variables  $a_{Eff}$ ,  $a_{Energy}$ ,  $a_{CO2}$  and  $a_H$  are the scores on each criterion:

$$e = 0.03a_{Eff} + 0.04a_{Energy} + 0.01a_{CO2} + 0.01a_H + 0.23(a_{Eff} \wedge a_{Energy}) \\ + 0.19(a_{Eff} \vee a_{CO2}) + 0.29(a_{Eff} \vee a_H) + 0.08(a_{Energy} \wedge a_{CO2}) \\ + 0.05(a_{Energy} \wedge a_H) + (a_{CO2} \wedge a_H).$$

The 20 actions were ranked from the least important to the most important (see Table 7).

The expected planning of works (ranking on actions) (see Table 7) was almost respected and accepted, except for actions 4, 9 and 3. In fact, the decision aid process applied using Choquet integral has offered the opportunity to the DM to reconsider some of his preferences on actions.

## 5. Discussion and conclusion

The Sustainable Development (SD) principle is difficult to implement within an Organization. SD principle seeks for more participation and more accountability in framing decision and choosing short and long terms actions to reach sustainability. There is rarely an optimal solution in SD but most frequently a need to build compromises between conflicting aspects such as economic, social and environmental ones and different expectations of stakeholders. Moreover, information is rarely available and precise. In this paper we have used a Multi-Criteria Decision Aid (MCDA) methodology to cope with these difficulties.

MCDA methodology offers the opportunity to avoid monetization of the different dimensions of the SD. These dimensions are not substitutable for one another and all have a role to play. MCDA is a branch of decision theory where actions or alternatives are chosen considering several points of view or criteria, assuming that the decision maker (DM) has all the information at his disposal concerning the alternatives, i.e., they are fully described by a vector of attributes which is supposed to be known without uncertainty. Two main features of this kind of problem make it difficult to solve. The first one is that attributes describing alternatives are heterogeneous, i.e., they represent different physical (or economical, subjective, etc.) entities like price, size, color, weight, etc. and may be numerical or not. Hence a first difficulty is to make them commensurable in some sense. The second feature is that points of view or criteria are more or less important to make a decision, and most often they are conflicting or interacting in some way, so that it is not obvious how to combine them for reaching a final overall opinion.

There are several possible aggregation procedures in MCDA methodology. We have proposed a method to choose an adequate aggregation procedure for SD problems. Outranking approach (i.e., ELECTRE) easily solves the commensurateness problem by making pair wise comparisons. Mono-criterion synthesis approaches (i.e., MAUT approaches) rely on the construction of utility functions, which can be fairly difficult because of incommensurability problems, but then easily reach a final decision by combining utilities or scores of all criteria.

In this paper we have implemented two aggregation procedures to rank SD actions within a public Organization: ELECTRE III at a strategical level of decision and MAUT method based on the Choquet integral at an operational level of decision within an expertise Institute. Both methods present advantages and difficulties in a real life situation. The implementation of the ELECTRE III method for the ranking of 22 SD actions offer the opportunity to discuss incomparability situations ( $R$ ) where the actors involved can

discuss their different visions and opinions about the implementation of the SD actions. However, the interest of the relation  $R$  is lost when dealing with more than 100 actions. That is due to the difficulty to read the final graph with all the comparison situations ( $I, P, Q, R$ ). The Analyst is then obliged to use the final pre-order to communicate the results. But let us note that this method is easy to understand and communicate, perhaps due to the fact that the actors involved were familiar with this method that was used in daily situations for risk management and risk analysis problems (i.e., pesticide ranking, industrial accident scenario ranking, etc.). Nevertheless, it is difficult to explain to the DM that the final pre-order can change if new SD actions are introduced. Even if actors understand that this result is due to a pair wise comparison, they still consider that it is due to the non robustness of the method.

The implementation of the MAUT method based on Choquet integral was very helpful at an operational level. First, the engineer culture within the Institute is familiar with numbers and they appreciate the results of this method that offer the possibility of having a final score on actions that respect the incommensurability between the criteria. Second, this method offers the possibility of building a real interaction between the Analyst and the DM and testing the coherence on the action ranking. However, the main inconvenience is to request the DM to give a preliminary desired global score on the actions. This can be possible if the DM has a limited set of actions and if he knows the actions that he has to rank well.

One year after the implementation of the SD plan, the Ministry of Finance and Industry and the Ministry of Environment were both attracted by the ability of the MCDA methods to reach the goal of more transparency, more accountability and more participation in the way public funding are spent and the goal of sustainability is achieved. The Institute is now engaged in a sharing methodological process within the 60 public Organizations that are members of the SD French club.

In 2011, The Institute has started framing its second SD Plan for the period 2012–2015. The experience feedback learned from the implementation of the 1st SD plan was that even if the participative process (including the 600 workers of the Institute and the other large set of stakeholders) was long, hard and expensive one, it has reach the objectives of being effective, legitimated by and transparent to all stakeholders. All the actions identified in the SD action plan were implemented and followed each year by the staff of Directors. Let us notice that even if one of the challenges of the SD plan was to open the scope of sustainability to social and economical dimensions, the first set of actions that was implemented was the one with the more environmental expected benefit (see Table 1). We do think that this is due to the fact that these actions were the more strongly regulated by the environmental legislation.

## References

- Bana e costa, C.A., De corte, J.M., Vansnick, J.C., 2005. On the mathematical foundation of MACBETH. In: Figueira, J., Greco, S., Ehrgott, M. (Eds.), *Multiple Criteria Decision Analysis: State of the Art Surveys*. Springer Verlag, Boston, Dordrecht, London, pp. 409–443.
- Behzadian, M., Kazemzadeh, R.B., Albadvi, A., Aghdasi, M., 2010. PROMETHEE: a comprehensive literature review on methodologies and applications. *European Journal of Operational Research* 200 (1), 198–215.
- Chevallier, J.J., 1999. DPM, Démarche Participative Multicritère pour la gestion environnementale". Groupe de recherche interdisciplinaire pour le développement durable (GRIDD). Université de Laval, Québec, p. 20.
- De montis, A., De toro, P., Droste-franke, B., Omann, I., Stagl, S., 2003. Sustainable development and evaluation: some criteria for quality assessment of MCDA methods. *Revista Multidisciplinar de Gestion Ambiental* 51, 18–27.
- De montis, A., De toro, P., Droste-franke, B., Omann, I., Stagl, S., 2004. Criteria for quality assessment of MCDA-methods. In: Getzner, M., Spash, C., Stagl, S. (Eds.), *Developing Alternatives for Valuing Nature*. Routledge, pp. 61–87.
- Development core team. R., 2005. A language and environment for statistical computing. R Foundation for Statistical Computing, Vienna, Austria. ISBN 3-900051-00-3.

- Faucheux S., Froger G., Munda G., 1998. Multicriteria decision aid and the sustainability tree. In: Faucheux, S., O'Connor, M., (Eds.), *Valuation for Sustainable Development: methods and policy indicators*, Edward Elgar, *Advances in Ecological Economics Series*, pp. 187–214.
- Figueira, J., Roy, B., 2002. Determining the weights of criteria in the ELECTRE type methods with a revised Simos' procedure. *European Journal of Operational Research* 139 (2), 317–326.
- Girard, L.F., De toro, P., 2007. Integrated spatial assessment: a multicriteria approach to sustainable development of cultural and environmental heritage in San Marco dei Cavoti, Italy. *CEJOR* 15, 281–299.
- Grabisch, M., Kojadinovic, I., Meyer, P., 2006. kappalab: non additive measure and integral manipulation functions. R package version 0.3
- Guitouni, A., Martel, J-M., 1998. Tentative guidelines to help choosing an appropriate MCDA method. *European Journal of Operational Research* 109 (2), 501–521.
- Hokkanen, J., Salminen, P., 1997. ELECTRE III and IV decision aids in an environmental problem. *Journal of Multi-Criteria Decision Analysis* 6, 215–226.
- Hokkanen, J., Lahdelma, R., Miettinen, K., Salminen, P., 1998. Determining the implementation order of a general plan by using a multicriteria method. *Journal of Multi-Criteria Decision Analysis* 7, 273–284.
- Janssen, R., 1992. *Multiobjective Decision Support for Environmental Problems*. Kluwer, Dordrecht.
- Kangas, J., Kangas, A., Leskinen, P., Pykäläinen, J., 2001. MCDM methods in strategic planning of forestry on state-owned lands in finland: applications and experiences. *Journal of Multi-Criteria Decision Analysis* 10, 257–271, 1992.
- Kowalski, K., Stagl, S., Madlener, R., Omann, I., 2009. Sustainable energy futures: methodological challenges in combining scenarios and participatory multicriteria analysis. *European Journal of Operational Research* 197, 1063–1074.
- Labreuche, Ch., Grabisch, M., 2006. Generalized Choquet-like aggregation functions for handling bipolar scales. *European Journal of Operational Research* 172, 931–955.
- Maystre, L.Y., Bollinger, D., 1999. *Aide à la négociation multicritère*". Presse Polytechniques et Universitaires Romandes, *Collection gérer l'environnement*, Lausanne.
- Maystre, L.Y., Pictet, J., Simos, J., 1994. *Méthodes multicritères ELECTRE: Description, conseils pratiques et cas d'application à la gestion environnementale*. Presses Polytechniques et Universitaires Romandes, *Collection gérer l'environnement*, Lausanne.
- Merad, M., 2002. Post mining management in the Lorraine region: method of grading of mining subsidence risk under building and infrastructure. In: 12th SRA Europe Annual Meeting, 21–24 juillet. Berlin, Allemagne.
- Merad, M., 2010. *Aide à la décision et expertise en gestion des risques*. Editions Lavoisier. 256 pages. ISBN: 978-2-7430-1265-6, Paris, 2010.
- Merad, M., Verdel, T., Roy, B., Kouniali, S., 2004. Use of multi-criteria decision-aids for risk zoning and management of large area subjected to mining-induced hazards. *Tunnelling and Underground Space Technology* 19 (2), 125–138.
- Munda, G., 1995. *Multicriteria Evaluation in a Fuzzy Environment*. Physica-Verlag, Heidelberg, Allemagne.
- Omann, I., 2004 *Multi-Criteria Decision Aid as an Approach for Sustainable Development Analysis and Implementation*, PHD Thesis.
- Paruccini, M., 1994. *Applying Multiple Criteria Aid for Decision to Environmental Management*. Kluwer Academic Publishers, Dordrecht-Boston, London.
- Ramanathan, R., Ganesh, L.S., 1995. Energy resource allocation incorporating qualitative and quantitative criteria: an integrated model using goal programming and AHP. *Socio-Economic Planning Sciences* 29 (3), 197–218.
- Rezaei-moghaddam, K., Karami, E., 2008. A multiple criteria evaluation of sustainable agricultural development models using AHP. *Environment, Development, and Sustainability* 10, 407–426.
- Roy, B., Bouyssou, D., 1992. *Aide multicritère à la décision*. Paris, Economica, pp. 415–434.
- Vincke, Ph., 1986. Analysis of multicriteria decision aid in Europe. *European Journal of Operational Research* 25 (2), 160–168.