



UNIVERSITY OF LEEDS



ILHAM-EC

# Introduction to Multi-Criteria Analysis

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Co-funded by the  
Erasmus+ Programme  
of the European Union



**Acknowledgements:** Dr Dan O'Neill and Prof Jouni Paavola, University of Leeds



# Learning goal and outline

## LEARNING GOAL

- To understand the rationale, processes and practices of Multi-Criteria Analysis (MCA)

## OUTLINE

- What is MCA?
- What are the steps of MCA and its decision models?
- How is MCA applied in environmental research?
- Strengths and weaknesses of MCA
- Reflections (brief exercise)



## What is MCA?

- Human beings (and thus decision makers!) struggle to deal with complex problems involving **multiple assessment criteria**
- MCA provides a **structured method for making decisions** between a number of competing alternatives
- It considers multiple criteria
- Overcoming **limitations of conventional “monetary” valuation**: difficult to monetise “non-use” values
  - MCA allows to **integrate monetary-based techniques with non-monetary valuation** (e.g. comparing “pears” – \$ values – with “apples” – qualitative ranking)
- Does not search for the “optimal” solution, but for the best “compromise” solution



## General Properties of MCA

- Helps with large amounts of complex data
- Establishes **preferences between alternatives** by reference to an explicit set of **objectives** that decision makers have identified, and for which they have established measurable **criteria**
- Techniques may be used to:
  - **Identify** a single most-preferred alternative
  - **Rank** alternatives
  - **Short-list** a number of alternatives for further appraisal
  - **Distinguish** between acceptable and unacceptable alternatives
- Emphasis is on the judgement of decision makers (weighting)

# Impact Matrix for MCA of Road Building

		Criteria		
		Cost (£)	Forest lost (ha)	Effect on human health (deaths/year)
Alternatives	Straight through the nature reserve	25	1200	1
	Through major cities	140	10	15
	Avoiding both the nature reserve and cities	76	680	4



## “Mixed-type” Data

- MCA is designed to deal with **information that cannot be easily converted to a single measurement unit** (e.g. \$), and is therefore difficult to compare
- Can **include** very **different criteria** (e.g. economic, social, environmental, technical), which can be expressed in **quantitative** and **qualitative** terms
- This differentiates MCA from other methods, such as Cost-Benefit Analysis



# Stakeholder Participation

- MCA enables the **inclusion of different stakeholders' views and interests**, which may embody conflicting priorities
- Helps to improve the **understanding** of a particular situation, including the perspectives of key players
- Increases the **transparency** and **quality** of decisions and helps **to avoid conflicts**



# Applicability to Environmental Problems

- **Complex and multi-faceted**
  - Involves socioeconomic, ecological, and political issues
  - Entails a certain degree of **scientific and technical uncertainty**
- Demands the **inclusion** of stakeholders
- Often difficult to arrive at straightforward and unambiguous solutions
- MCA is a good tool for evaluating environmental problems and their solutions





## Steps in a MCA

1. Establish the **decision context**
  - What are the aims of the MCA?
  - Who are the stakeholders?
2. Identify the **alternatives**
3. Identify the **criteria** and **objectives** for each
4. **Score** each alternative against the criteria (i.e. generate the performance/impact matrix)
5. Choose the **decision model**
  - MCA techniques are largely distinguished from one another by how they process the information in the performance matrix
6. Assign relative **weights** to each of the criteria
7. Combine the weights and scores for each of the alternatives to arrive at **rankings**
8. Perform a **sensitivity analysis**



## Some Common Decision Models

- **Direct analysis**
  - Dominance occurs when one alternative performs as well as another on all criteria and better than the other on at least one criteria
- **Linear additive models**
  - Multiplies the value score on each criterion by the weight of that criterion, and adds all weighted scores together
- **Analytical Hierarchy Process (AHP)**
  - Uses procedures for deriving weights and scores by pairwise comparisons
- **Outranking methods**
  - One alternative outranks another if it outperforms the other on enough criteria of sufficient importance *and* does not record a low level of performance on any single criterion



## MCA in Action

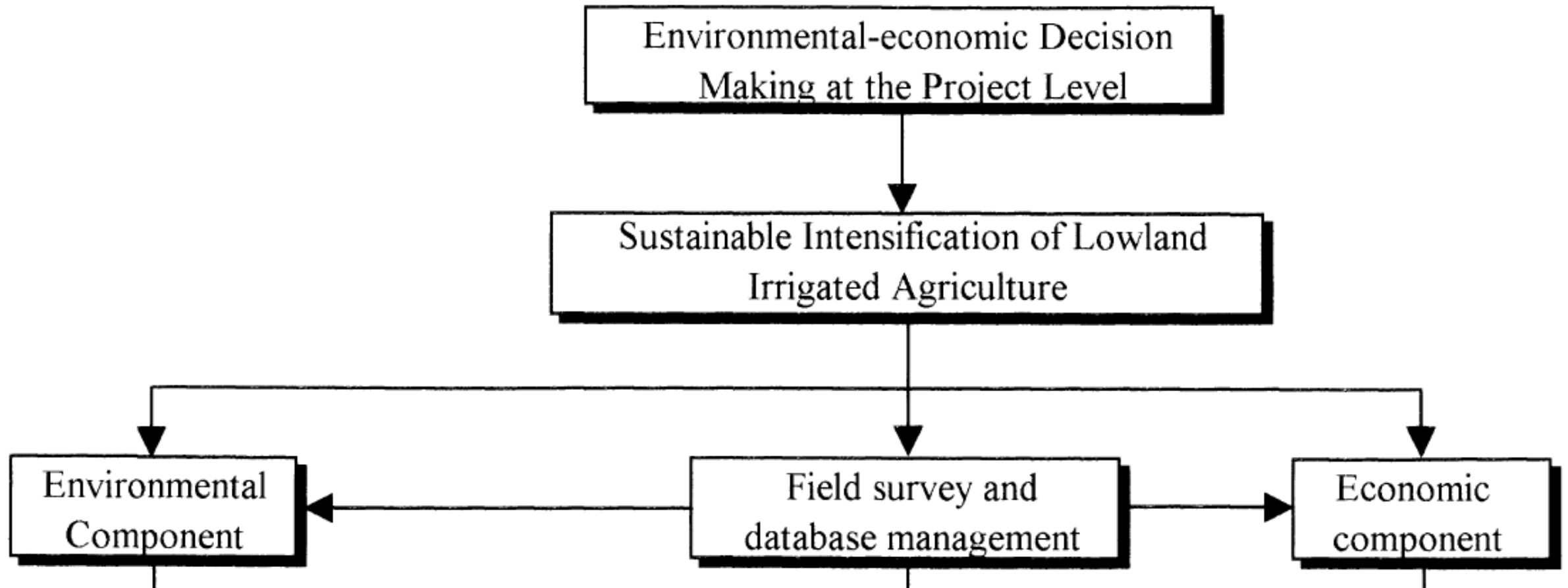
- Tiwari et al. (1999) conducted a MCA for an agricultural cropping project in the Phitsanulok province of Thailand
- The local authorities wished to modify existing cropping patterns in order to optimise the use of the available productive land, while assuring the sustainability of the region



*Tiwari et al. 1999. Environmental-economic decision-making in lowland irrigated agriculture using multi-criteria analysis techniques. Agricultural Systems 60(2), p. 99-112*



## MCA in Action (conceptual framework, Tiwari et al. (1999))





## MCA in Action

- **Step 1: Establish the decision context**
  - **Aims:** Determine the best cropping pattern to optimise the use of the land while assuring regional sustainability
  - **Stakeholders:** Mainly farmers and local villagers
- **Step 2: Identification of alternatives**

*Table. Different alternatives for cropping patterns*

Source: Marco Sakai, based on Tiwari et al. (1999)

A <sub>1</sub>	Continuation of existing cropping patterns
A <sub>2</sub>	Priority for non-rice crops in highly suitable areas
A <sub>3</sub>	No cultivation in low-resource areas
A <sub>4</sub>	Rice cultivation in all areas
A <sub>5</sub>	Cropping patterns according to farmers' preferences



## MCA in Action

- **Step 3: Identification of criteria and objectives**
  - Through a series of **participatory meetings** and **expert consultations**, a list of relevant criteria was agreed

*Table. Different criteria for evaluating alternatives*

Source: Marco Sakai, based on Tiwari et al. (1999)

<i>Criterion</i>	<i>Objective</i>	<i>Units</i>
Land capability	Maximise	Ha
Water requirement	Minimise	Millions of cubic metres
Energy output-input ratio	Maximise	Ratio
Environmental costs	Minimise	Monetary
Farmers' NPV	Maximise	Monetary
Societal NPV	Maximise	Monetary

## MCA in Action

- **Step 4: Assess each alternative against each of the criteria (create the *performance matrix*)...**

*Table. Performance matrix* (Note: Numbers are fictitious and for purposes of illustration only)

	Land capability (ha)	Energy output-input ratio	Water requirement (million m <sup>3</sup> )	Environmental costs (\$)	Farmers' NPV (\$)	Societal NPV (\$)
<b>A1</b>	27,190	4.8	271	21.47	66.85	-206.98
<b>A2</b>	33,775	5.7	209	9.98	345.63	382.57
<b>A3</b>	27,734	5.3	213	11.92	175.40	109.19
<b>A4</b>	34,765	4.8	355	28.68	166.19	-280.82
<b>A5</b>	34,757	5.6	239	10.89	684.89	607.14

## MCA in Action

- **Step 4: (...continued) Score** each alternative against the criteria
  - HOMOGENEOUS MCA score

Source: N Favretto, based on Tiwari et al. (1999)

**Table.** MCA score (min=0 ; max=100)

Note: Numbers are fictitious and for purposes of illustration only

	Land capability	Energy output-input ratio	Water requirement	Environmental costs	Farmers' NPV	Societal NPV
<b>A1</b>	52	12	44	98	10	5
<b>A2</b>	90	81	59	76	21	46
<b>A3</b>	89	92	76	53	43	14
<b>A4</b>	42	48	88	42	72	2
<b>A5</b>	34	22	97	21	80	25





## MCA in Action

- **Step 5: Choose the decision model**
  - CP and AHP (but let's pretend it's a linear additive model)



## MCA in Action

- **Step 6: Assign relative weights to each of the criteria**
  - Two sets of weights were formulated.

*Table. Criteria weighting*

Source: Marco Sakai, based on Tiwari et al. (1999)

Note: Numbers are fictitious and for purposes of illustration only

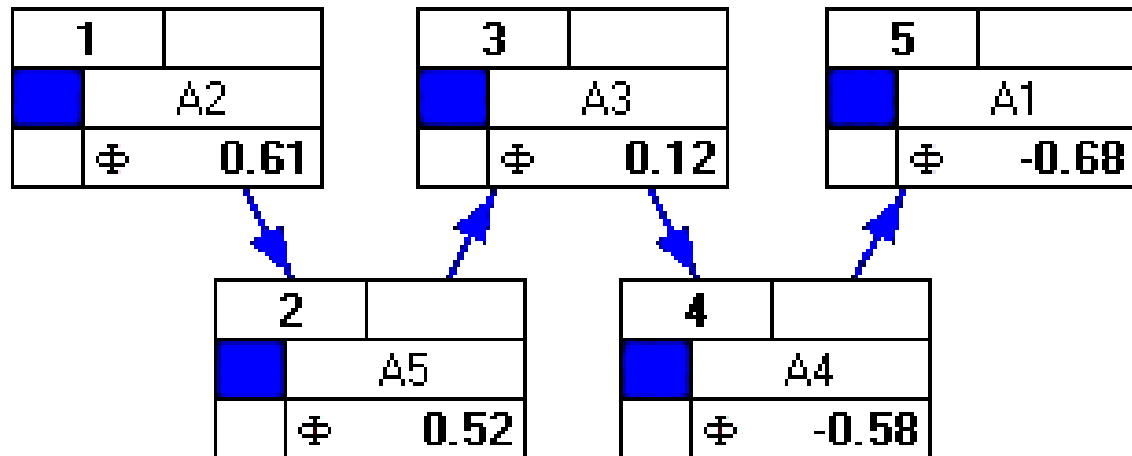
Criterion	W1	W2
Land capability	10%	10%
Energy output-input ratio	10%	20%
Water requirement	<b>30%</b>	20%
Environmental costs	10%	<b>30%</b>
Farmers' NPV	<b>30%</b>	10%
Societal NPV	10%	10%
<u>TOTAL</u>	<u>100%</u>	<u>100%</u>

The first gave priority to **water savings and farmers' welfare** (w1), while the second prioritised **environmental issues** (w2)

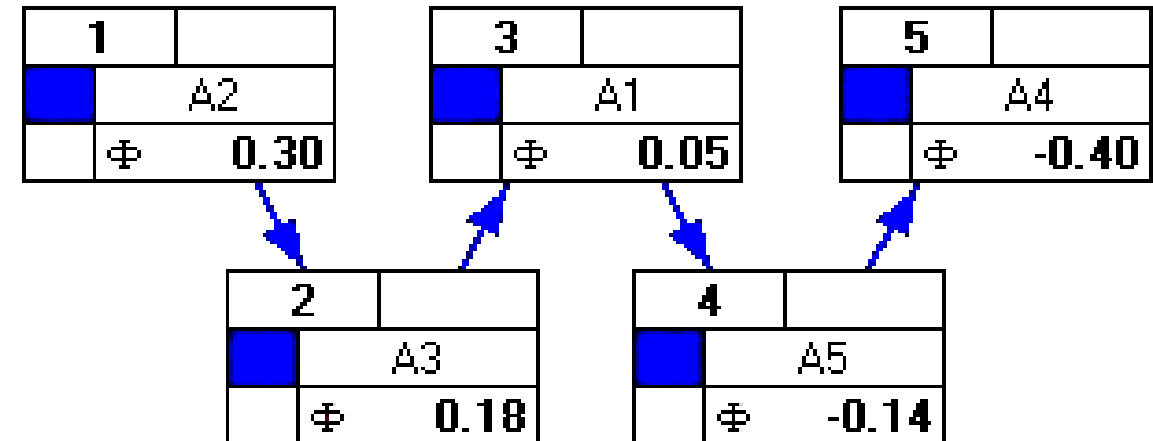
## MCA in Action

- Step 7: Combine the weights and scores for each of the alternatives to arrive at rankings

**Figure 1.** Ranking of alternatives using  $w1$  weightings



**Figure 2.** Ranking of alternatives using  $w2$  weightings



Source: Marco Sakai, based on Tiwari et al. (1999)

Note: Numbers are fictitious and for purposes of illustration only



## Sensitivity analysis

- Changing the values of the parameters: checking the indicators give the same results, e.g.
  - Double or halve the **weighting** of “one” or “multiple” criteria ... will the ranking change?
  - Double (**BLUE**) or halve (**RED**) the **score** of “one” or “multiple” criteria

	Land capability	Energy output-input ratio	Water requirement	Environmental costs	Farmers' NPV	Societal NPV
A1	52	12	44	98	10	5
A2	90	81	59	76	21	46
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A4	42	48	88	42	72	2
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## ELD case study: use of MCA in Botswana's Kalahari

- **Aim:** To assess the costs, benefits and trade-offs associated with different land uses and management strategies in rangeland systems
- Integration of policy and price data analysis with 12 ecological assessments (phosphorus based sampling approach and satellite data), 37 semi-structured interviews, literature review & secondary data analysis, and benefit transfer method



*"Which land uses and land management strategies are best placed to deliver specific ES in Kalahari rangelands in Botswana's southern Kgalagadi district?"*



# Criteria definition & assessment

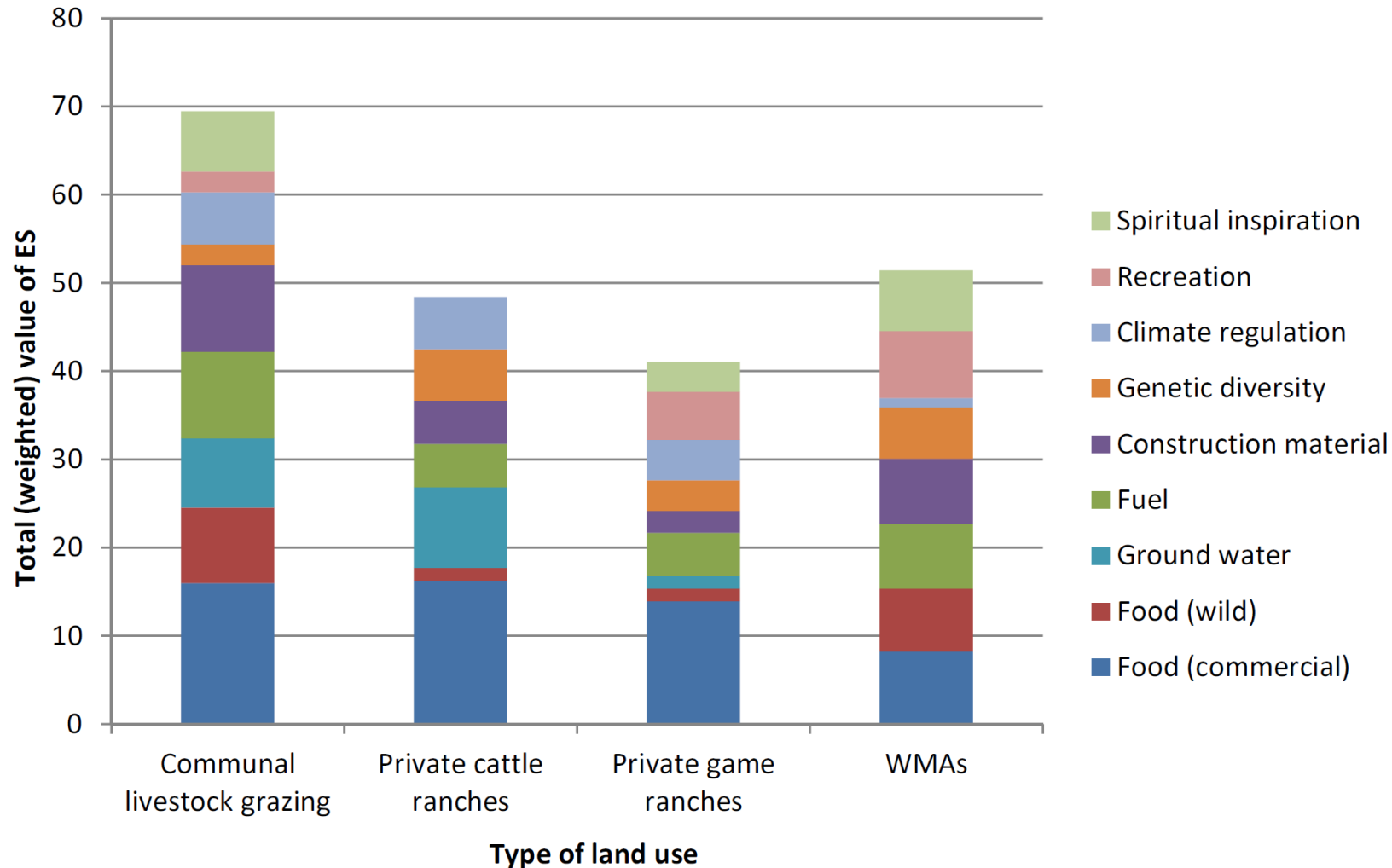
<b>Food (commercial)</b>	<ul style="list-style-type: none"> <li>• Net profit of meat production (US\$/ha/yr)</li> <li>• Stocking level (Ha/Livestock Unit)</li> </ul>
<b>Food (wild)</b>	<ul style="list-style-type: none"> <li>• Gathering of veld products</li> <li>• Subsistence hunting</li> </ul>
<b>Fuel</b>	<ul style="list-style-type: none"> <li>• Firewood collection</li> </ul>
<b>Construction material</b>	<ul style="list-style-type: none"> <li>• Collection of thatching grass and poles for fencing</li> </ul>
<b>Ground water</b>	<ul style="list-style-type: none"> <li>• Value of water extracted (US\$/ha/yr)</li> </ul>
<b>Genetic diversity</b>	<ul style="list-style-type: none"> <li>• Genetic diversity between forage species</li> <li>• Genetic diversity between livestock breeds</li> </ul>
<b>Climate regulation</b>	<ul style="list-style-type: none"> <li>• Value of carbon sequestration (US\$/ha/yr)</li> </ul>
<b>Recreation</b>	<ul style="list-style-type: none"> <li>• Revenues from Community Based Natural Resource Management trophy hunting &amp; photographic safari (US\$/ha/yr)</li> <li>• Ecotourism potential</li> <li>• Wild animal diversity</li> </ul>
<b>Spiritual inspiration</b>	<ul style="list-style-type: none"> <li>• Presence of landscape features or species with spiritual value</li> </ul>

# Criteria performance

Criterion	Indicator / ecosystem service category	Communal livestock grazing	Private cattle ranches	Private game ranches	Wildlife Management Areas	Valuation/collection methods used to inform the MCDA
<b>Provisioning</b>						
<b>Food (commercial)</b>	Net profit of meat production (US\$/ha/yr)	(-0.56 ; 1.95) Mean: 0.64	(0.66 ; 1.75) Mean: 1.21	(-7.89 ; 3.75) Mean: -2.07	0	Interviews & market prices
	Stocking level (Ha/LSU)	9-13 Mean: 11	8-20 Mean: 14	7-12 Mean: 9.5	120-200 Mean: 160	Interviews & literature
<b>Food (wild)</b>	Gathering of veld products	High	Low	Low	Medium	Interviews & literature
	Subsistence hunting	High	Very low	Very low	Very high	Interviews & literature
<b>Fuel</b>	Firewood collection	Very high	Medium	Medium	High	Interviews & literature
<b>Construction material</b>	Collection of thatching grass and poles for fencing	Very high	Medium	Low	High	Interviews & literature
<b>Ground water</b>	Value of water extracted (US\$/ha/yr)	(0.63 ; 1.05) Mean: 0.84	(0.22 ; 1.71) Mean: 0.97	0.15	0	Interviews & market prices
<b>Genetic diversity</b>	Genetic diversity between forage species	Low	Medium	High	Very high	Ecological assessments
	Genetic diversity between livestock breeds	Low	High	Very low	Low	Interviews
<b>Regulating</b>						
<b>Climate regulation</b>	Value of carbon sequestration (US\$/ha/yr)	6.1	6.1	4.9	1.2	Benefit transfer & market prices
<b>Cultural</b>						
<b>Recreation</b>	Revenues from CBNRM trophy hunting and photographic safari (US\$/ha/yr)	0	0	0	0.04	Interviews & benefit transfer
	Ecotourism potential	Low	Very low	High	Very high	Interviews
	Wild animals diversity	Medium	Very low	Very high	Very high	Literature
<b>Spiritual inspiration</b>	Presence of landscape features or species with spiritual value	Very high	Very low	Medium	Very high	Interviews



# Weighted performance of the four alternative land uses







## Strengths of MCA

- Inclusion of a wide array of **heterogeneous data**, as well as alternatives and objectives
- Ability to include **mixed types of data** makes it a good approach to address complex issues
- Allows **broad participation**, and gives the opportunity for stakeholders to learn from the process
- A **flexible, open, consistent, and transparent** procedure that helps to legitimise decision-making activities
- Objectives and criteria are open to analysis and change (as are scores and weights)



## Weaknesses of MCA

- Results are only as good as the data, weights, and scores used
- Implementation can be a time-consuming process, due to the **technical complexity** involved, especially in eliciting parameters
- Different decision models (or stakeholder groups) can lead to different outcomes
- **Inter-comparison** of case studies can be **difficult** due to methodological differences



## Conclusions

- MCA helps to provide insight into the nature of complex problems
- Proven to be very useful when dealing with environmental issues
- Its usefulness explains why governments in several countries have increased attention to this method (e.g. the US currently requires it by law for issues such as water planning)
- Development of new methods and improvement of existing ones, along with the **potential to combine MCA with other techniques**, will strengthen its future application