

**Decision Analysis**  
**Part 1**  
Decision Analysis and Decision Tables

Marko Boharac

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**Decision Analysis, Part 1**

- Introduction to Decision Analysis
  - Concepts: modelling, evaluation, analysis
  - Decision Problem-Solving: Stages
  - Relation of DA to some other Disciplines
- Decision-Making under Uncertainty
  - Decision-Making under Strict Uncertainty
    - Decision Table
    - Various Decision Criteria
  - Decision-Making under Risk
    - Expected Value
    - Sensitivity Analysis

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**Decision Analysis**

**Decision Analysis:** Applied Decision Theory

Provides a framework for analyzing decision problems by

- structuring and breaking them down into more manageable parts,
- explicitly considering the:
  - possible alternatives,
  - available information
  - uncertainties involved, and
  - relevant preferences
- combining these to arrive at optimal (or "good") decisions

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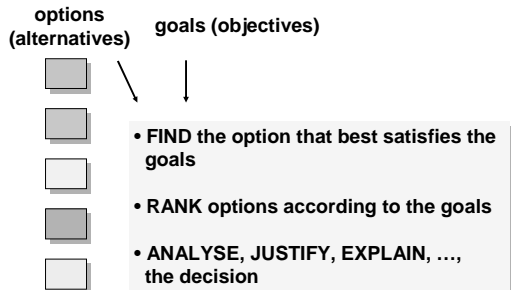
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## Decision-Making Problem



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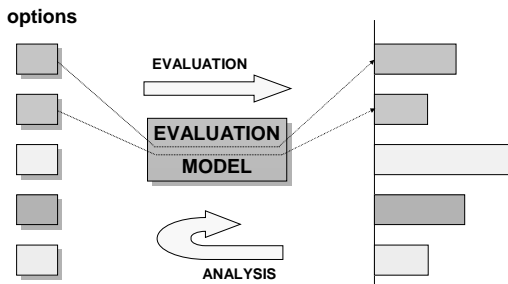
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## Evaluation Models



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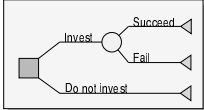
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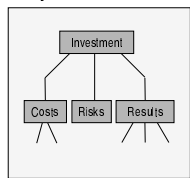
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## Types of Models in Decision Analysis

### Decision Trees

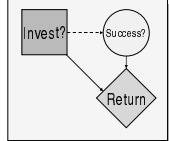


### Multi-Attribute Utility Models



Analytic Hierarchy Process

### Influence Diagrams



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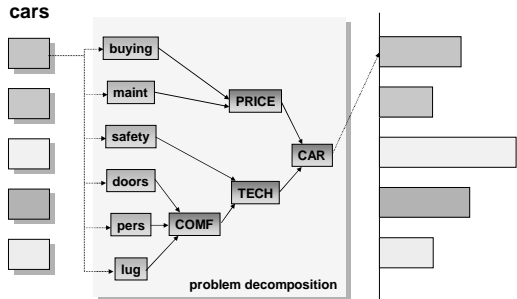
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## Multi-Attribute Models



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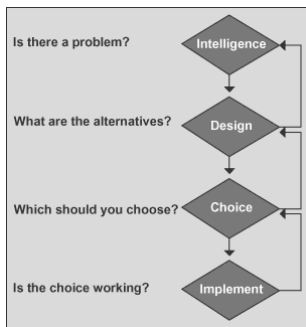
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## Decision-Making Process



Source: Decision Analysis – A Tool to Deal with Uncertainty, [http://www.dmrview.com/article\\_sub\\_dm?articleId=6935](http://www.dmrview.com/article_sub_dm?articleId=6935) Marko Bohar.ec

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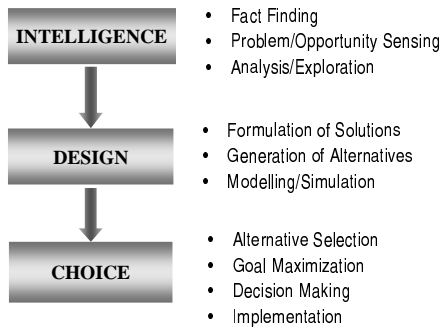
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## Decision-Making Process



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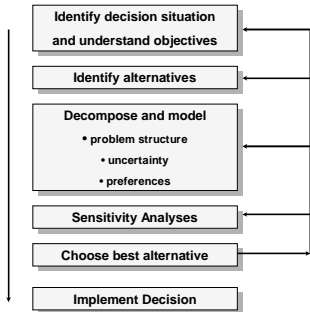
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## The Decision Analysis Process



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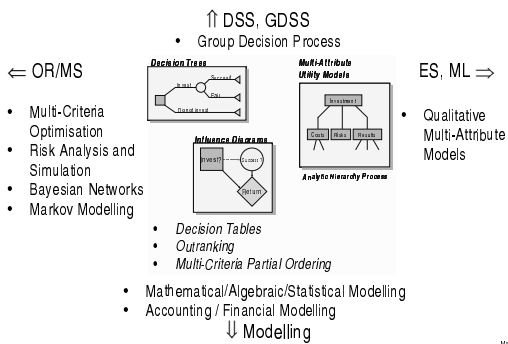
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## Decision Analysis: Related Disciplines



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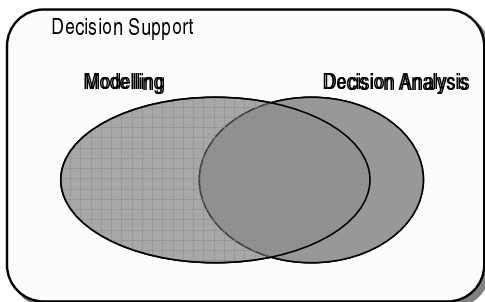
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## Decision Support and Decision Modeling



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## Decision-Making under Uncertainty

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## Decision-Making Problem

Suppose that one must choose between several *uncertain alternatives*.

**Given:**

- *Alternatives*;
- The *consequences* of choosing each alternative, described with a *single number*, e.g. profit / loss in € or aggregated value.

**Task:** Which alternative to choose?

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## Decision Table

Decision-Making under Strict Uncertainty

State of the world (Event)	Value of alternatives 1 ... m		
$\theta$	$a_1$	...	$a_m$
$\theta_1$	$y_{11}$	...	$y_{1m}$
:	:		:
$\theta_n$	$y_{n1}$	...	$y_{nm}$

Decision-Making under Risk

State of the world (Event)	Probability that $\theta$ will happen	Value of alternatives 1 ... m		
		$a_1$	...	$a_m$
$\theta_1$	$p(\theta_1)$	$y_{11}$	...	$y_{1m}$
:	:	:		:
$\theta_n$	$p(\theta_n)$	$y_{n1}$	...	$y_{nm}$

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## Working Example

A manufacturing company, faced with a possible increase in demand for its product, considers the following:

**Alternatives:**

1. *status quo*: no change
2. *extend*: extending their production line buying a new machine
3. *build*: building a new production hall with new equipment
4. *cooperate*: finding additional business partners for production

**Uncertainty involved:**

Market reaction: after the decision, the sales can *increase* or *decrease*.

**Consequences:**

*Expected profit*, shown in decision table on the next slide

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## Working Example

Decision table

		<i>alternative</i>			
		<i>status quo</i>	<i>extend</i>	<i>build</i>	<i>cooperate</i>
<i>states</i>	<i>decreased sales</i>	28	24	16	30
	<i>increased sales</i>	30	42	44	34

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## Decision-Making under Strict Uncertainty

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## Decision Criteria

- Dominance
- Pessimistic (Maximin, Wald's)
- Optimistic (Maximax)
- Hurwicz's
- Laplace's
- Minimax Regret

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## Dominance

- Choose the alternative with best consequences in all states of the world.
- Such alternative is seldom found.

		<i>alternative</i>			
		<i>status quo</i>	<i>extend</i>	<i>build</i>	<i>cooperate</i>
<i>states</i>	<i>decreased sales</i>	28	24	16	30
	<i>increased sales</i>	30	42	44	34

No dominant alternatives in this case

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## Pessimistic Criterion (Wald's, Maximin)

- Each alternative is represented by its *worst* possible consequence.
- According to these, the alternative with the *best* worst case is chosen.

		<i>alternative</i>			
		<i>status quo</i>	<i>extend</i>	<i>build</i>	<i>cooperate</i>
<i>states</i>	<i>decreased sales</i>	28	24	16	30
	<i>increased sales</i>	30	42	44	34
<b>Pessimist</b>		<b>28</b>	<b>24</b>	<b>16</b>	<b>30</b>

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## Optimistic Criterion (Maximax)

- Each alternative is represented by its *best* possible consequence.
- The alternative for which this *best* consequence is best is chosen.

		alternative			
		status quo	extend	build	cooperate
states	decreased sales	28	24	16	30
	increased sales	30	42	44	34
Optimist		30	42	<u>44</u>	34

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## Hurwicz's Criterion

- Introduce a parameter  $d \in [0, 1]$ .
- Combine Optimistic and Pessimistic criteria so that

$$u_h = du_o + (1-d)u_p$$

		alternative			
		status quo	extend	build	cooperate
states	decreased sales	28	24	16	30
	increased sales	30	42	44	34
Pessimist		28	24	16	<u>30</u>
Optimist		30	42	<u>44</u>	34
Hurwiz ( $d=0,3$ )		28,6	29,4	24,4	<u>31,2</u>

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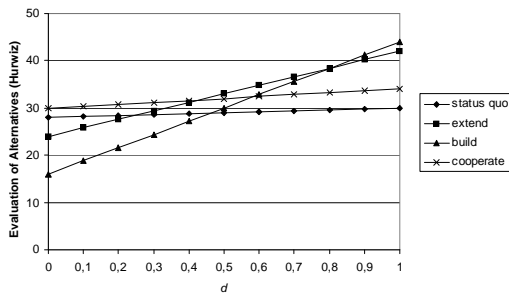
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## Hurwicz's Criterion



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## Laplace's Criterion

- Consider all states (events) equally likely,
- thus, consider the *average* of outcomes for each alternative.

		alternative			
		status quo	extend	build	cooperate
states	decreased sales	28	24	16	30
	increased sales	30	42	44	34
Laplace		29	<u>33</u>	30	32

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## Minimax Regret

The **regret**  $r_{ij}$  for the alternative  $a_j$  in state  $\theta_i$  is equal to the difference between the best alternative in given state  $\theta_i$  and  $a_j$ :  $r_{ij} = \max_{k=1}^m \{y_{ik}\} - y_{ij}$

Choose the alternative having the least maximum regret.

		alternative			
		status quo	extend	build	cooperate
States	decreased sales	30-28=2	30-24=6	30-16=14	30-30=0
	increased sales	44-30=14	44-42=2	44-44=0	44-34=10
Regret		14	<u>6</u>	14	10

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## Summary

		alternative			
		status quo	extend	build	cooperate
states	decreased sales	28	24	16	30
	increased sales	30	42	44	34
Pessimist		28	24	16	<u>30</u>
Optimist		30	42	<u>44</u>	34
Hurwiz ( $\alpha=0,3$ )		28,6	29,4	24,4	<u>31,2</u>
Laplace		29	<u>33</u>	30	32
Regret		14	<u>6</u>	14	10

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## Questions

- If you were the manager, which alternative would you take? Why?
- Is this really the best alternative? Why? Under which circumstances it is best?
- What can you say about the *status quo* alternative? According to the analysis, when should be it taken, or should it be taken at all?

Markus Bohmer

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## Questions

Assess the presented decision criteria:

- Describe the prevalent characteristics of each criterion
- What do you think about the criteria:
  - Are they comprehensible?
  - Are they realistic?
  - Are they useful for practice?
  - Which is your favourite criterion?
- Is there a single "best" criterion? Which and why?

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## Decision-Making under Risk

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## Working Example

Now we know (or estimate) the *probability* of states

states	probability	alternatives			
		status quo	extend	build	cooperate
decreased sales	25%	28	24	16	30
increased sales	75%	30	42	44	34

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## Decision Criteria

- Mode: Select the most probable state
- Expected Value (EV), Expected Monetary Value (EMV)

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## Expected (Monetary) Value

Maximise the expected value:  $EV_i = \sum_{j=1}^n p(\theta_j) y_{ji}$

states	probability	alternatives			
		status quo	extend	build	cooperate
decreased sales	25%	28	24	16	30
increased sales	75%	30	42	44	34
<b>Expected value</b>		0,25×28+ 0,75×30= <b>29,5</b>	0,25×24+ 0,75×42= <b>37,5</b>	0,25×16+ 0,75×44= <b>37</b>	0,25×30+ 0,75×34= <b>33</b>

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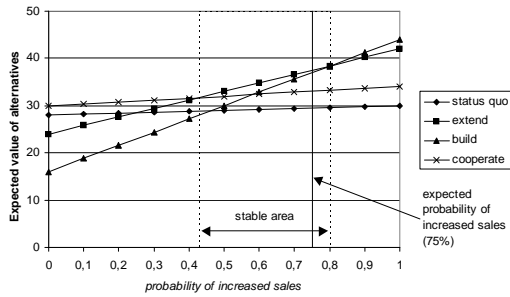
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## Sensitivity Analysis



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## Exercise 1

	$P(\theta)$	$a_1$	$a_2$	$a_3$
$\theta_1$	2/9	8	4	20
$\theta_2$	3/9	7	15	10
$\theta_3$	4/9	6	5	0

Given this decision table:

- Determine which alternative is best according to all the criteria (Dominance, Pessimistic, Optimistic, Hurwiz ( $d=0.7$ ), Laplace, Regret, Mode, Expected Value).
- Draw a chart evaluating the Hurwiz's criterion for  $d \in [0,1]$ .
- Do sensitivity analysis.

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## Exercise 2

Help the farmer who is deciding which crop to plant in the face of uncertain weather and resulting crop yield:

probability	Weather		
	.55 Normal	.15 Drought	30 Rainy
Plant soybeans	\$ 10	5	12
Plant corn	7	8	13

profit per acre

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### Exercise 3

1. Define a decision problem of your own,
2. represent it in a decision table,
3. and repeat the steps of Exercise 1

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### Exercise 4

Using some decision table,  
implement in spreadsheet software (such as MS Excel):

- evaluation of alternatives using all the criteria,
- drawing the chart associated with Hurwiz's criterion
- drawing the sensitivity analysis chart

Compare the two charts.

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