

# Introduction to Decision Support

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Programme: Information and Communication Technologies

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## Addressed Topics

- Decision Making and Decision Support:
  - Basic concepts and definitions
  - Overview of scientific disciplines
- Decision Support at JSI  
with examples of projects and applications
- Rationale for including this topic in this ICT programme



## Symbols



Important topic:

- required understanding
- possible exam questions



Related to contents of other ICT courses



Pay attention to related slides  
above or below



## Decision Making



**Decision:**

*Conscious and deliberate*  
selection of one alternative (option)  
from a set of possible ones  
in order to satisfy the goals of the decision maker(s).



**Making a decision:**

- involves an irrevocable allocation of resources (time, money, effort, ...)
- has consequences
- is inherently subjective (subject to individual and/or societal values)



## Decision Process



### Decision Making:

Is a process that involves:

- identification of the decision problem;
- collecting and verifying relevant information;
- identifying decision alternatives;
- anticipating consequences of decisions;
- making the decision;
- providing rationale for the decision;
- implementing the selected alternative;
- evaluating the consequences of the decision.

Typical stages of  
*Decision Analysis*

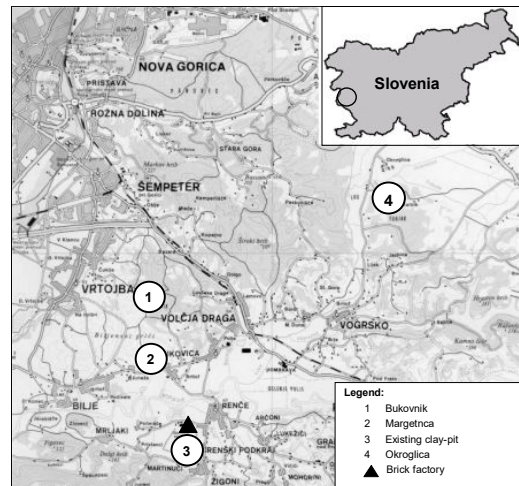


## Examples of Decision Problems

- Buying everyday goods
- Buying a car
- Buying a computer
- Choosing an apartment
- Buying a house
- Choosing a job
- Selecting an employee
- Study-related decisions:  
    which profession, university, study programme, course, ...
- ...
- Investment decisions
- Medical decisions
- ...



## Example 1: Clay-Pit Location



Bohanec, M., Rajkovič, V.: Multi-attribute decision modeling: Industrial applications of DEX, *Informatica* 23, 487-491, 1999.

## Example 2: Electric Energy Production Strategy in Slovenia



### Project OVJE 2013-2014

#### Aims of the study:

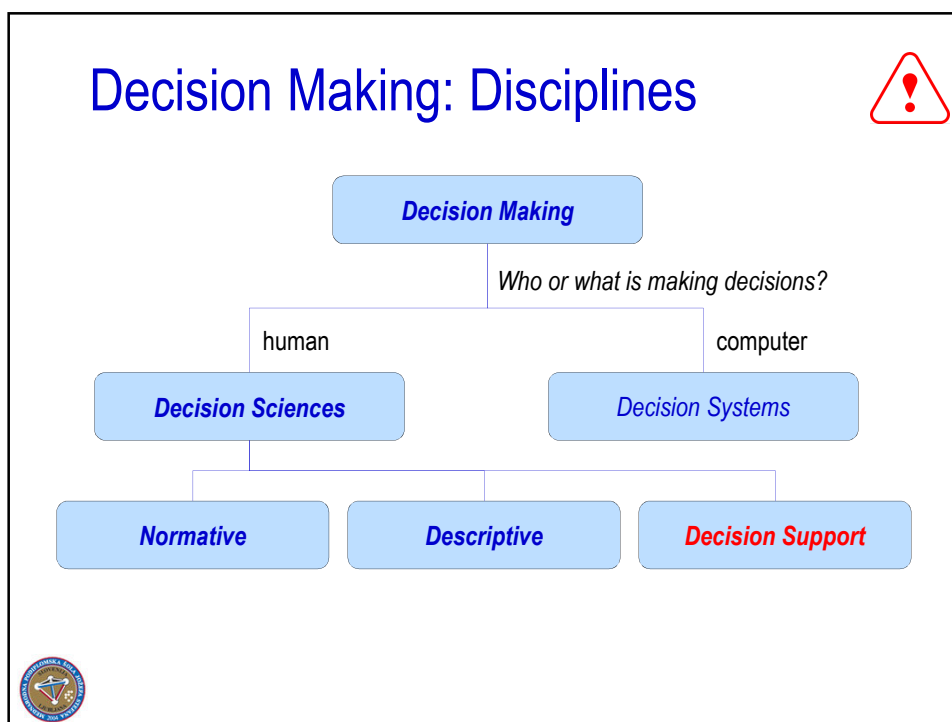
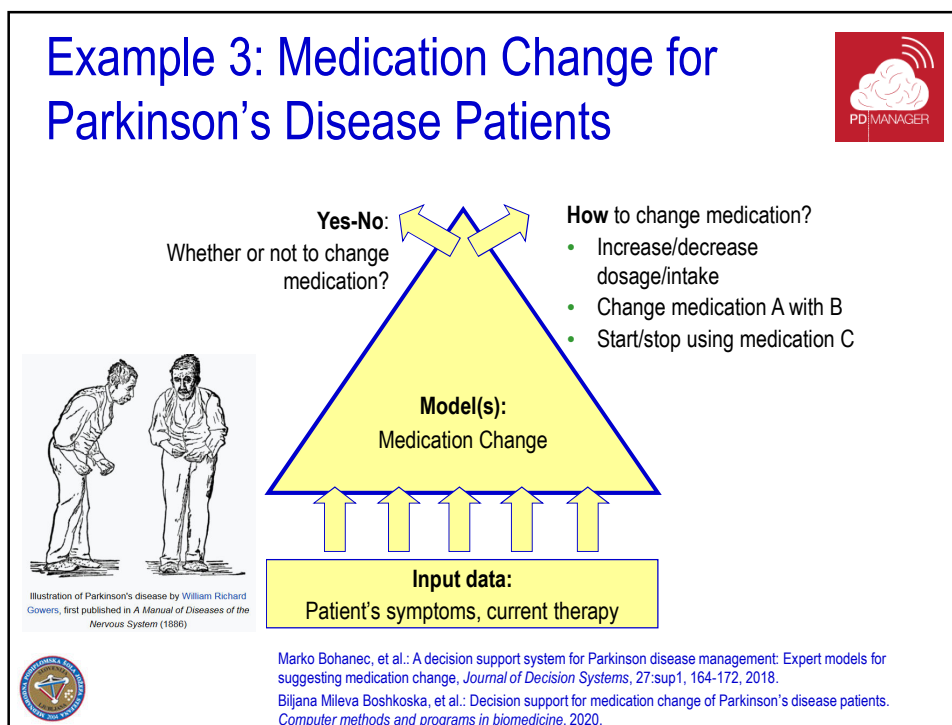
- Identify reliable, rational, and environmentally sound production of electric energy in Slovenia by 2050
- Consider technologies: hydro, coal, oil, gas, nuclear, biomass, photovoltaic, wind
- Assess individual technologies and technology mixtures

Kontić, B., Bohanec, M., Kontić, D., Trdin, N., Matko, M.: Improving appraisal of sustainability of energy options - A view from Slovenia, *Energy Policy* 90, 154-171, 2016.

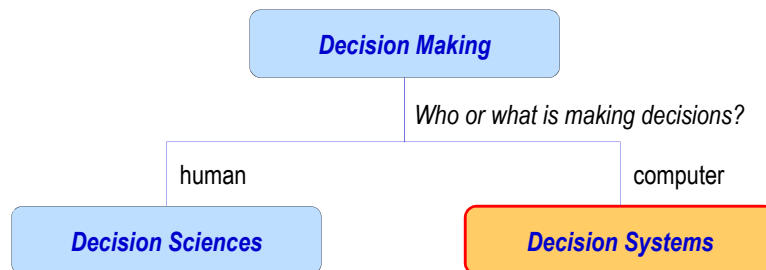


Bohanec, M., Trdin, N., Kontić, B.: A qualitative multi-criteria modelling approach to the assessment of electric energy production technologies in Slovenia. *Central European Journal of Operations Research*, 611-625, 2017.





## Decision Making: Disciplines



## Decision Systems



*Honda Asimo*

### Decision Systems

- computers
- intelligent programs and systems
- robots and autonomous systems



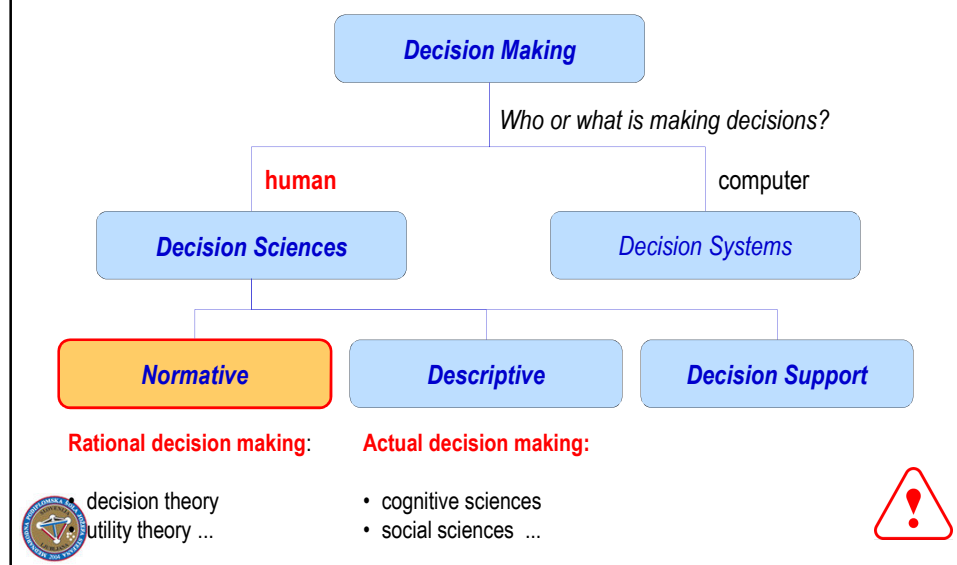
*Curiosity Mars Rover*



*Autonomous Cars*



## Decision Making: Disciplines



## Preference Relations

*Preference:* we like/desire/prefer one thing over another

*Preference relations:*

- $a \sim b$  indifference
- $a > b$  strict preference
- $a \geq b$  weak preference

Some properties:

- Given any  $a$  and  $b$ , then  $a > b$ ,  $a \sim b$  or  $a < b$
- If  $a \sim b$  and  $b \sim c$ , then  $a \sim c$
- If  $a > b$  and  $b > c$ , then  $a > c$
- If  $a \geq b$ , then  $a > b$  or  $a \sim b$

Preference relations are *subjective*!



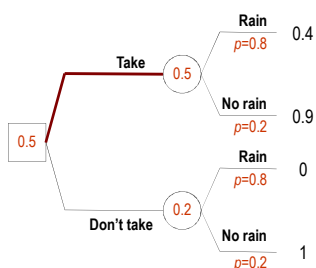
## Decision Theory



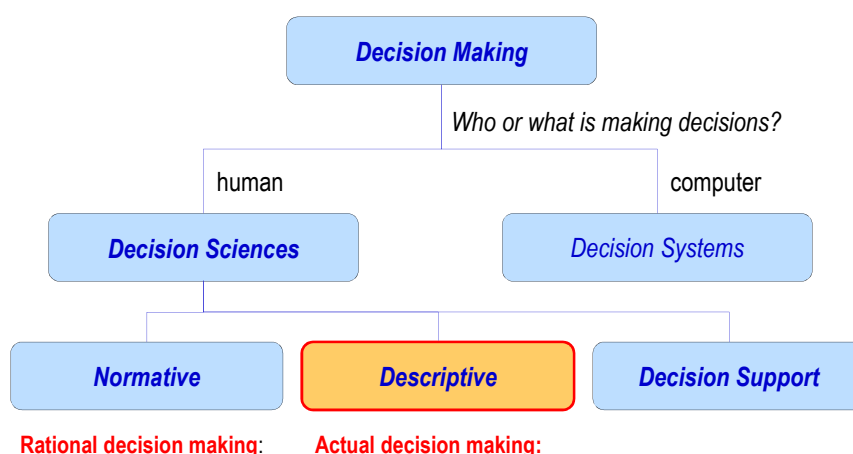
Decision table:

|        |               | Alternatives  |                      |
|--------|---------------|---------------|----------------------|
|        |               | Take umbrella | Do not take umbrella |
| States | Rains         | 0.4           | 0                    |
|        | Does not rain | 0.9           | 1                    |

Decision tree:



## Decision Making: Disciplines

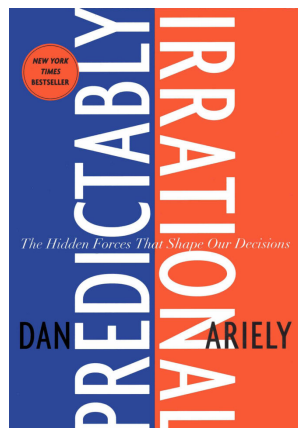


decision theory  
utility theory ...

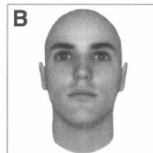
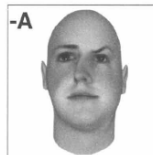
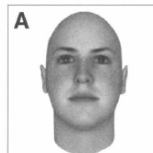
• cognitive sciences  
• social sciences ...



## Dan Ariely: Predictably Irrational

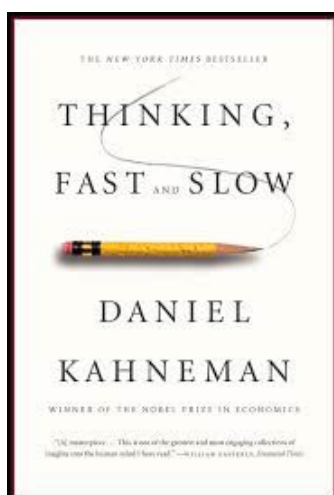


Condition A



- CHAPTER 1  
The Truth about Relativity  
*Why Everything Is Relative—Even When It Shouldn't Be*
- CHAPTER 3  
The Cost of Zero Cost  
*Why We Often Pay Too Much When We Pay Nothing*
- CHAPTER 4  
The Cost of Social Norms  
*Why We Are Happy to Do Things, but Not When We Are Paid to Do Them*
- CHAPTER 5  
The Influence of Arousal  
*Why Hot Is Much Hotter Than We Realize*
- CHAPTER 7  
The High Price of Ownership  
*Why We Overvalue What We Have*
- CHAPTER 9  
The Effect of Expectations  
*Why the Mind Gets What It Expects*
- CHAPTER 10  
The Power of Price  
*Why a 50-Cent Aspirin Can Do What a Penny Aspirin Can't*

## Daniel Kahneman: Thinking, Fast and Slow



### Part I. Two Systems

1. The Characters of the Story
2. Attention and Effort
3. The Lazy Controller
4. The Associative Machine
5. Cognitive Ease
6. Norms, Surprises, and Causes
7. A Machine for Jumping to Conclusions
8. How Judgments Happen
9. Answering an Easier Question

### Part II. Heuristics and Biases

10. The Law of Small Numbers
11. Anchors
12. The Science of Availability
13. Availability, Emotion, and Risk
14. Tom W's Specialty
15. Linda: Less is More
16. Causes Trump Statistics
17. Regression to the Mean
18. Taming Intuitive Predictions

### Part III. Overconfidence

19. The Illusion of Understanding
20. The Illusion of Validity
21. Intuitions Vs. Formulas
22. Expert Intuition: When Can We Trust It?
23. The Outside View
24. The Engine of Capitalism

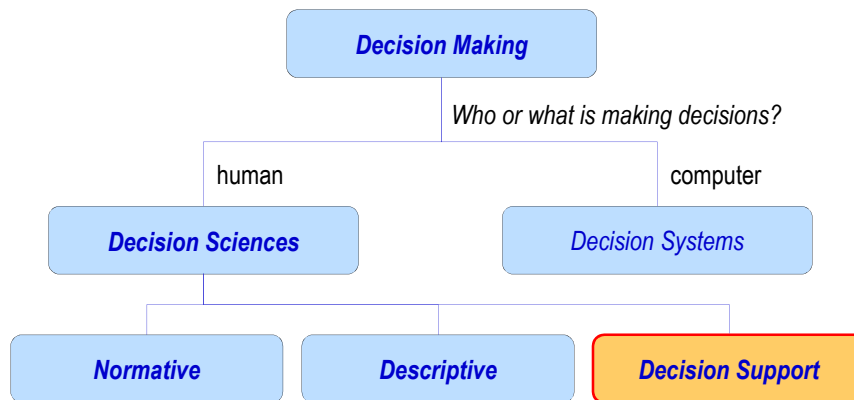
### Part IV. Choices

25. Bernoulli's Errors
26. Prospect Theory
27. The Endowment Effect
28. Bad Events
29. The Fourfold Pattern
30. Rare Events
31. Risk Policies
32. Keeping Score
33. Reversals
34. Frames and Reality

### Part V. Two Selves

35. Two Selves
36. Life as a Story
37. Experienced Well-Being
38. Thinking About Life

## Decision Making: Disciplines



## What is Decision Support?



Given the principles of rational decision making,  
knowing that actual decision making can be difficult for people,  
*can we help the (human) decision makers to make better decisions?*

### Decision Support:

Providing methods and tools for *supporting* people in making difficult decisions

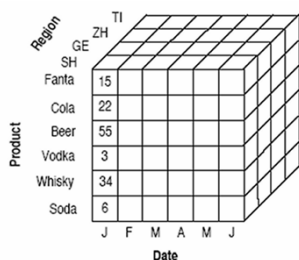
**It is not:** Making decisions *instead* or *on behalf* of people



How can we support decision making?



## Data Storage, Search and Retrieval



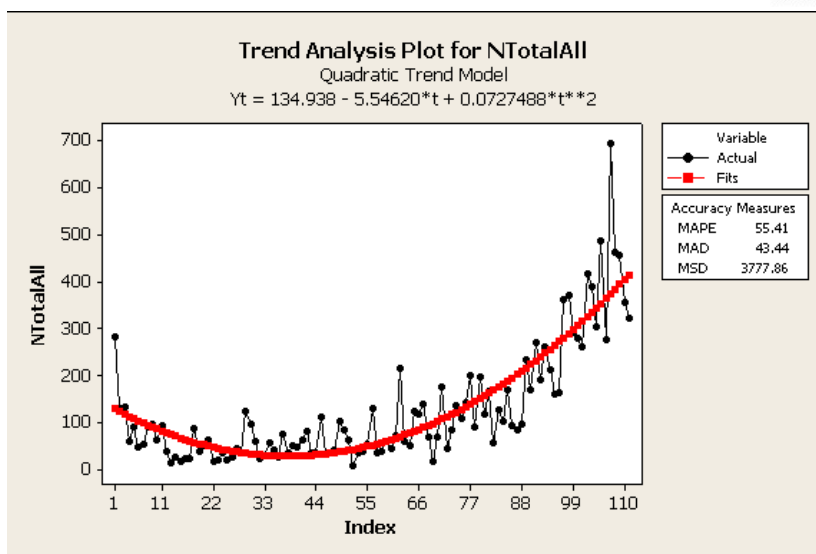
|    | A        | B                  | C        | D        | E    | F      | G      | H           |
|----|----------|--------------------|----------|----------|------|--------|--------|-------------|
| 1  | Category | (All)              |          |          |      |        |        |             |
| 2  |          |                    |          |          |      |        |        |             |
| 3  |          |                    |          |          |      |        |        |             |
| 4  | Title2   | Title              | Name     | First r  | Data | Gender |        |             |
| 5  | Group1   | Manager            | Crawford | Number   |      | F      | M      | Grand Total |
| 6  |          |                    |          | Salaries |      | 0.00%  | 10.13% | 10.13%      |
| 7  |          |                    |          | Number   |      |        | 1      | 1           |
| 8  |          |                    | Crosby   | Salaries |      | 0.00%  | 6.75%  | 6.75%       |
| 9  |          |                    | Jenkins  | Number   |      |        | 2      | 2           |
| 10 |          |                    |          | Salaries |      | 0.00%  | 14.75% | 14.75%      |
| 11 |          |                    | Thomas   | Number   |      | 1      |        | 1           |
| 12 |          |                    |          | Salaries |      | 6.75%  | 0.00%  | 6.75%       |
| 13 |          | Manager Number     |          |          |      | 1      | 4      | 5           |
| 14 |          | Manager Salaries   |          |          |      | 6.75%  | 31.63% | 38.38%      |
| 15 |          | Secretary Albright | Number   |          |      | 1      |        | 1           |
| 16 |          |                    | Salaries |          |      | 6.75%  | 0.00%  | 6.75%       |
| 17 |          | Thomas             | Number   |          |      |        | 1      | 1           |
| 18 |          |                    | Salaries |          |      | 0.00%  | 5.63%  | 5.63%       |
| 19 |          | Timmons            | Number   |          |      | 1      |        | 1           |
| 20 |          |                    | Salaries |          |      | 5.63%  | 0.00%  | 5.63%       |
| 21 |          | Secretary Number   |          |          |      | 2      | 1      | 3           |
| 22 |          | Secretary Salaries |          |          |      | 12.38% | 5.63%  | 18.00%      |

Data Cube

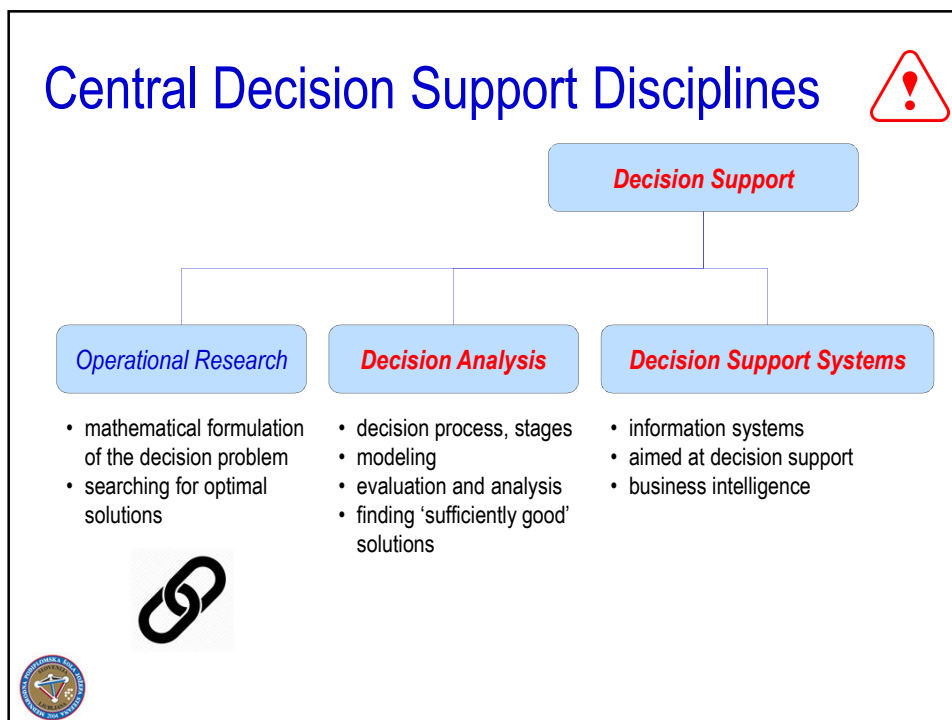
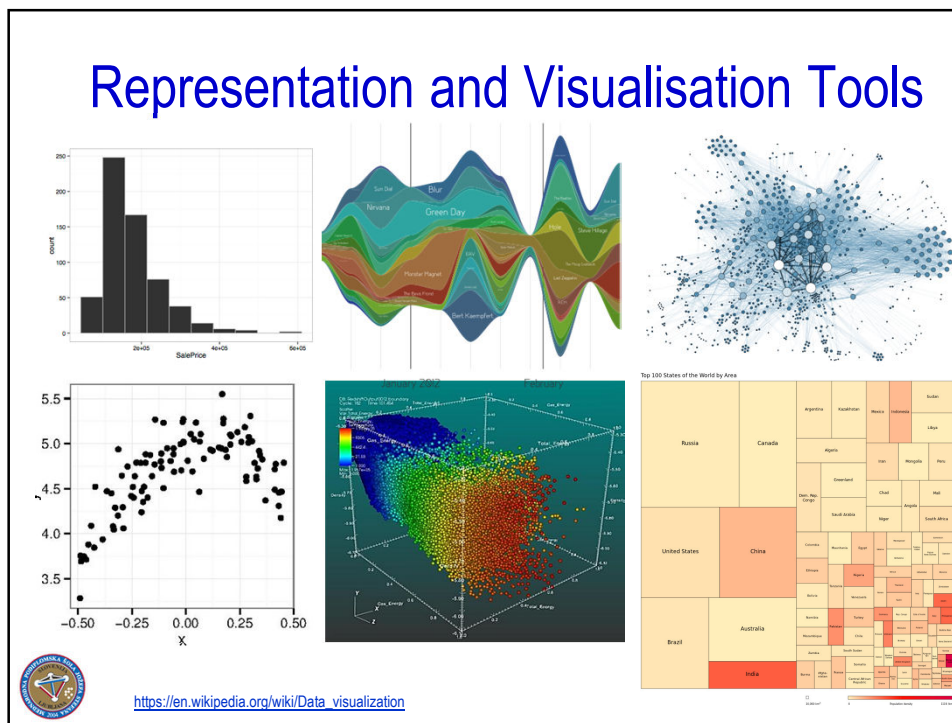
Pivot Table



## Data Analysis and Data Mining



[http://www.theintentionexperiment.com/wp-content/uploads/2009/01/trend\\_analysis\\_plot\\_for\\_ntotalall.bmp](http://www.theintentionexperiment.com/wp-content/uploads/2009/01/trend_analysis_plot_for_ntotalall.bmp)





## Decision Analysis

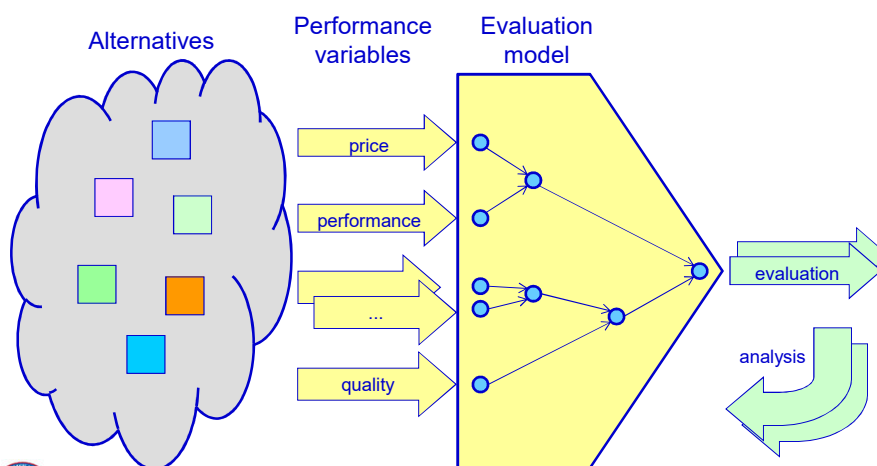


**Decision Analysis:** “Applied Decision Theory”

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
- developing models for the evaluation and analysis of alternatives
- following a systematic procedure (stages) 
- with the aim to arrive at “sufficiently good” decisions (“satisficing”) 

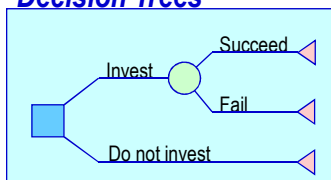
## Evaluation Models



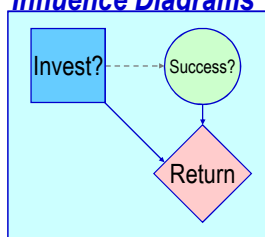
## Types of Models in Decision Analysis



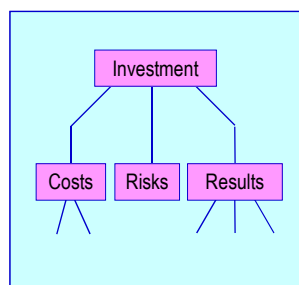
### Decision Trees



### Influence Diagrams



### Multi-Attribute Utility Models



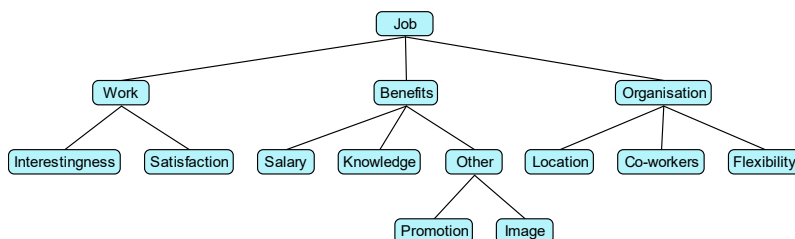
## Examples of Decision Models

pairwise comparison

| Alternative | A | B  | C | D  |
|-------------|---|----|---|----|
| A           |   | -1 | 1 | 0  |
| B           |   |    | 1 | 1  |
| C           |   |    |   | -1 |
| D           |   |    |   |    |

multi-attribute model

| Weight | Attribute       | Alternative | A   | B   | C   | D   |
|--------|-----------------|-------------|-----|-----|-----|-----|
| 10     | Salary          |             | 8   | 10  | 6   | 5   |
| 7      | Interestingness |             | 4   | 8   | 2   | 6   |
| 5      | Location        |             | 4   | 2   | 9   | 1   |
| 5      | Safety          |             | 4   | 6   | 9   | 2   |
| 4      | Image           |             | 8   | 9   | 7   | 7   |
| 3      | Promotion       |             | 6   | 4   | 8   | 10  |
| 3      | Co-workers      |             | 2   | 0   | 4   | 8   |
|        | Evaluation      |             | 204 | 244 | 228 | 189 |



hierarchical multi-attribute model



## Decision Support Systems (DSS)



### Decision Support Systems:

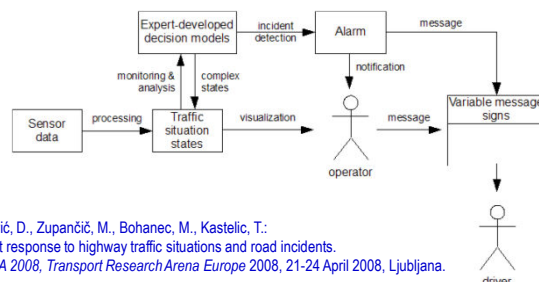
- interactive computer-based information systems
- that support decision-making activities

### Characteristics:

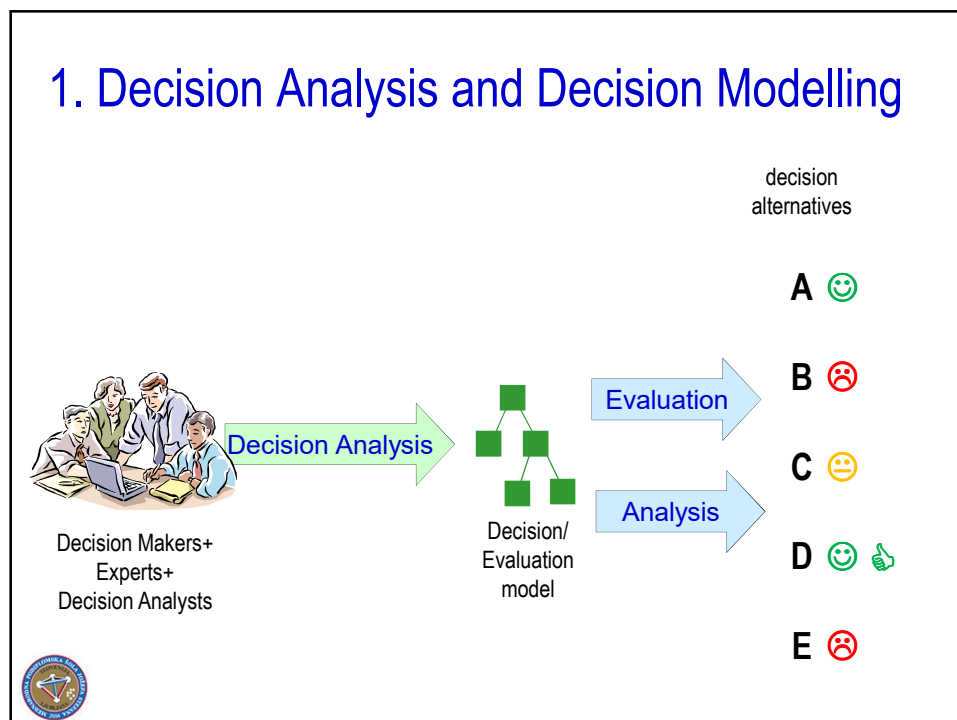
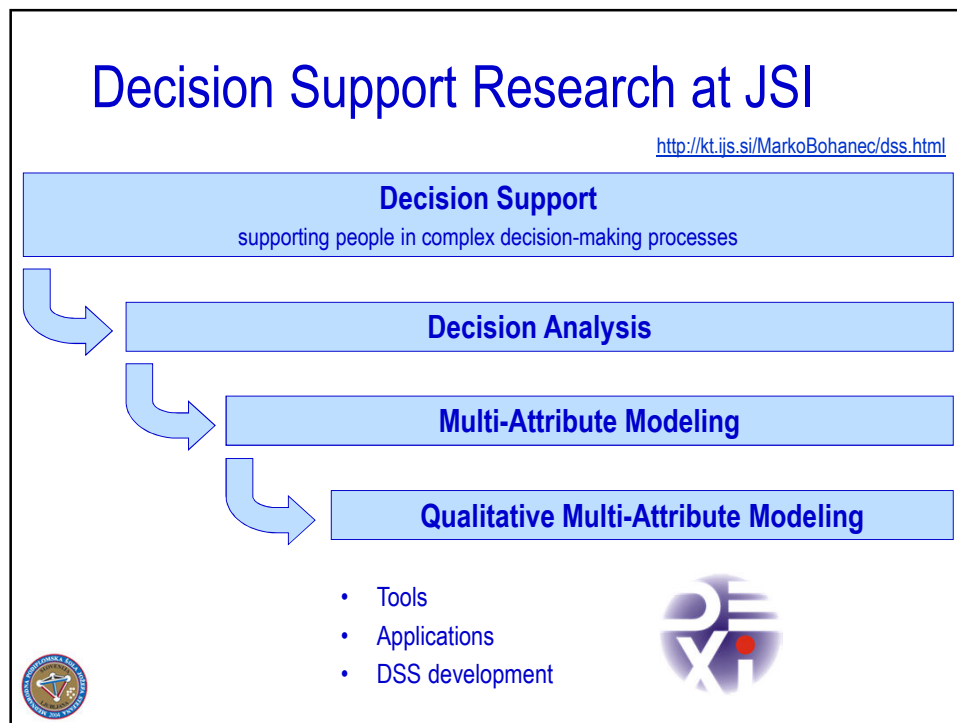
- DSS incorporate both data and models;
- they are designed to assist managers in their decision processes in semistructured (or unstructured) tasks;
- they support, rather than replace, managerial judgment;
- their objective is to improve the quality and effectiveness (rather than efficiency) of decisions.



## Example: Traffic Control DSS

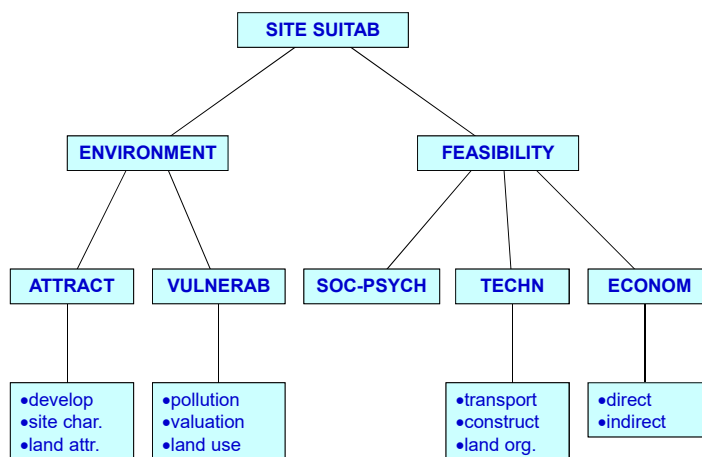


Omerčević, D., Zupančič, M., Bohanec, M., Kastelic, T.:  
Intelligent response to highway traffic situations and road incidents.  
*Proc. TRA 2008, Transport Research Arena Europe 2008, 21-24 April 2008, Ljubljana.*

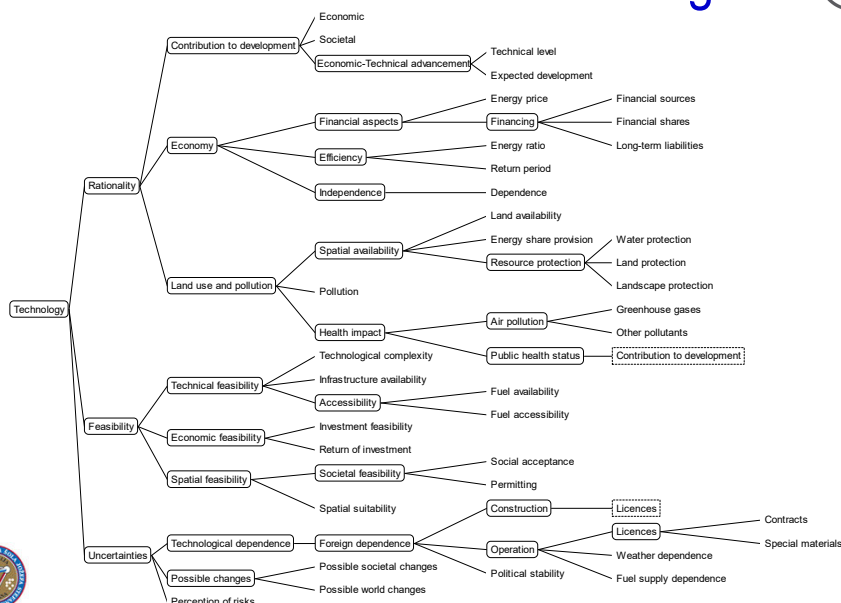





## Clay-Pit Location Model




## Model for Electric Prod. Technologies





## DEXi:

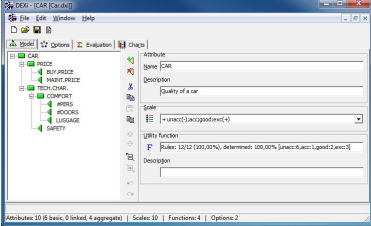
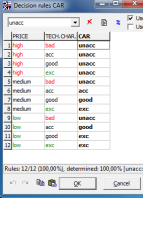
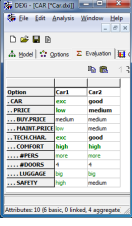
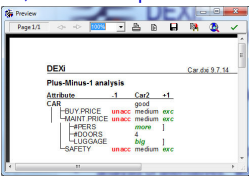
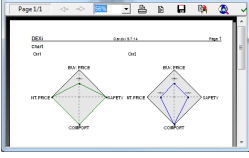
Program for Multi-Attribute Decision Making

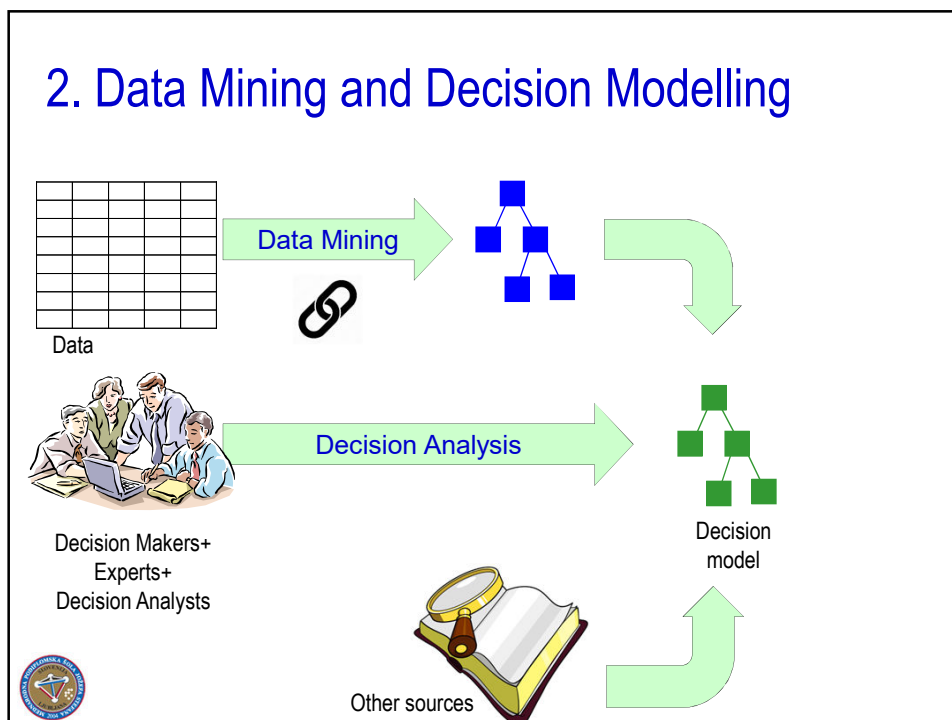


<http://kt.ijs.si/MarkoBohanec/dexi.html>

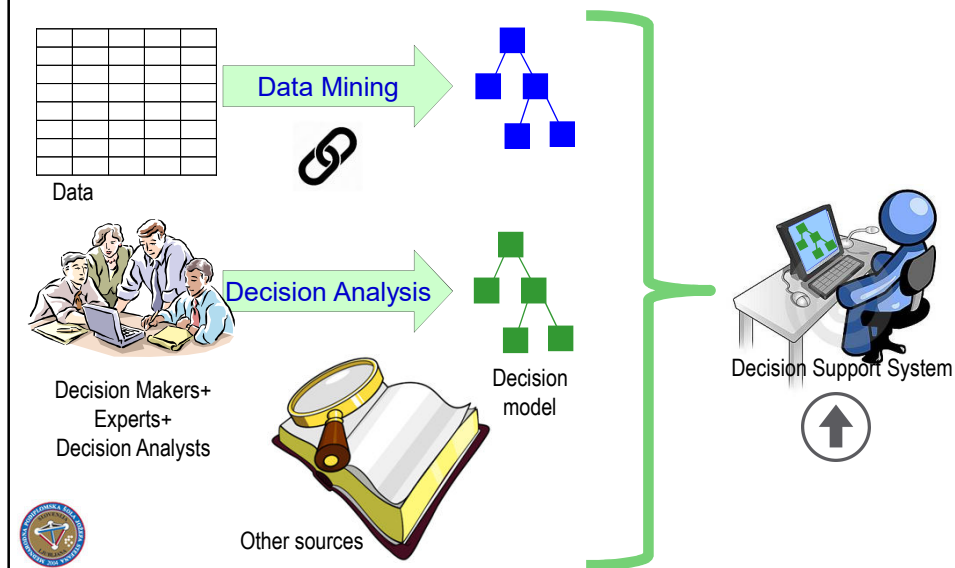
**Functionality**

- creation and editing of qualitative DEX models:
  - model structure
  - decision tables
- acquisition and evaluation of alternatives
- analysis of alternatives: "what-if", " $\pm 1$  analysis", comparison of alternatives, selective explanation
- tabular and graphical reports

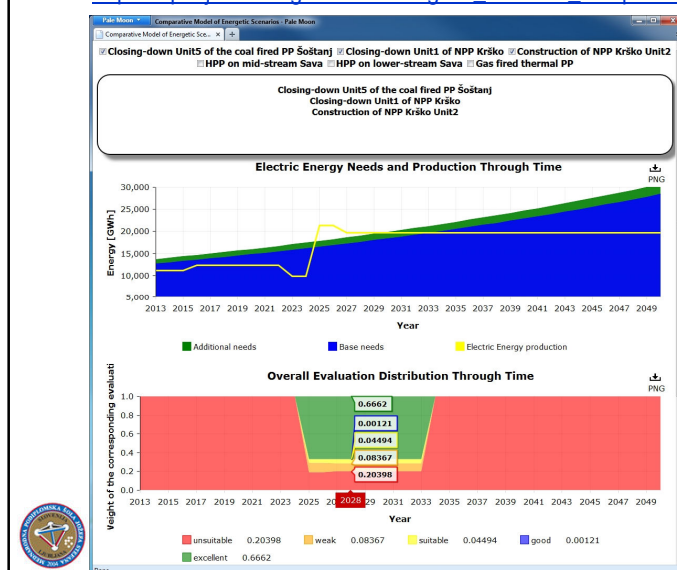


### 3. Decision Support Systems



### DSS for Electric Prod. Technologies

[http://sepo.ijs.si/naloge/OVJE/energetic\\_scenario\\_comparative\\_model/](http://sepo.ijs.si/naloge/OVJE/energetic_scenario_comparative_model/)



## From Models to Decision Support System

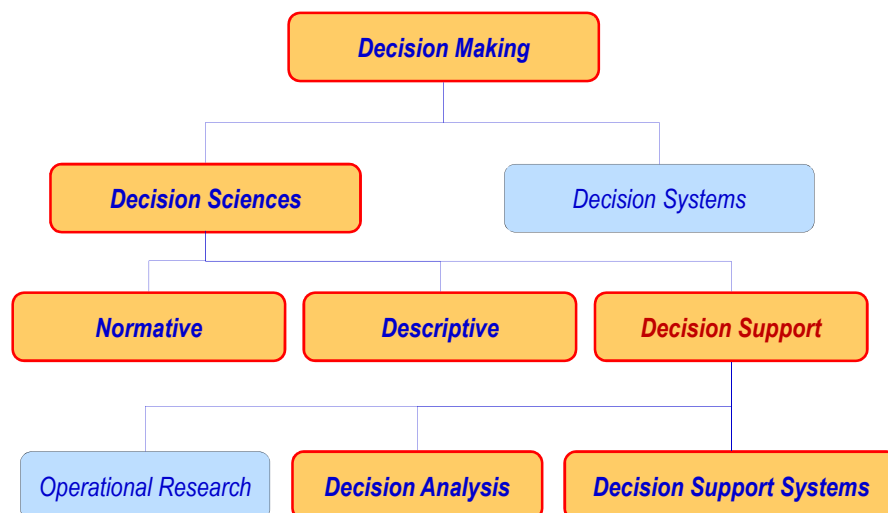


### Requirements:

- Completeness:
  - considering all relevant aspects of the decision problem
  - providing answers for all possible inputs
- Correctness: providing correct (valid, right) information
- Consistency: logical and preferential consistency
- Comprehensibility: provided information for the user
- Convenience: easily accessible, timely information, appropriate for the task



## Overview of Disciplines



## Take-Home Messages



- Decision is an act, decision-making is a process
- Decision Sciences vs. Decision Systems = human vs. machine decision making
- Main disciplines in *Decision Sciences*:
  - Normative: concerned with rational (ideal, theoretical) decision making
  - Descriptive: concerned with actual (human, practical) decision making
  - Decision Support: combining the two in order to help people in making decisions (and not to make decisions on behalf of them)
- *Decision Support*:
  - very wide area, involving everything from "pen-and-pencil" to advanced AI systems
  - Central disciplines: Operational research, Decision analysis, Decision Support Systems
- *Decision Analysis*:
  - a systematic approach: structuring the decision problem and identifying its key elements
  - developing and using models: decision trees, influence diagrams, multi-attribute models, ...
- *Decision Support Systems*: Information systems "aimed at decision support"
- *Decision Support at JSI*:
  - Key tasks and projects: developing decision models and DSSs for solving complex decision problems
  - Key approaches: expert modelling, possibly combined with data mining (and optimization)
  - Key tool: DEXi, software for developing qualitative multi-attribute models

