

# Numeric Relational Multi-Attribute Models in Qualitative Multi-Attribute Method DEX

Nejc TRDIN<sup>1,2</sup>, Marko BOHANEČ<sup>1,2</sup>

<sup>1</sup>"Jožef Stefan" Institute, Ljubljana, Slovenia

<sup>2</sup>Jožef Stefan International Postgraduate School, Ljubljana, Slovenia

18. June 2014

20th CONFERENCE OF THE INTERNATIONAL FEDERATION OF OPERATIONAL RESEARCH SOCIETIES



I F O R S

International Federation of Operational Research Societies

The Art of Modeling

**BARCELONA 2014**

13th-18th July

# Motivation

- DEX is a qualitative MCDM methodology, supported by implementation in DEXi
- It has been applied numerous times; ecology, financial domains, evaluation of projects, medicine, etc.
- More flexibility in methodology is needed, specifically in the direction of relational models and numerical attributes.

# Overview

- 1 DEX methodology
- 2 Formalization of DEX
- 3 Numeric relational models
- 4 Use-Case
- 5 Conclusion

# The DEX methodology

State of the art: General

- A qualitative multi-criteria decision making methodology
    - Developed model is a hierarchy of attributes
    - All attributes have symbolic values
- 1 M. Bohanec and V. Rajkovič. DEX: An expert system shell for decision support, *Sistemica*, vol. 1(1), pp. 145-157, 1990.
  - 2 M. Bohanec, DEXi: A program for multi-attribute decision making. <http://kt.ijs.si/MarkoBohanec/dexi.html>, June 2013.
  - 3 M. Bohanec, V. Rajkovič, I. Bratko, B. Zupan, M. ?nidar?i?. DEX methodology: Three decades of qualitative multi-attribute modelling. *Informatica* 37, 49-54, 2013.

# Formalization - DEX

## Attribute

### Attribute A:

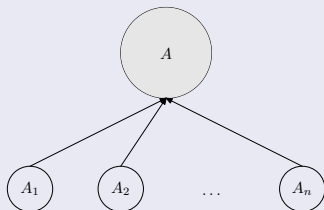
- most basic building block in the methodology.
- $D(A)$  is the domain: finite array of qualitative - symbolic values.

- For example:

- $D(A_1) = [low, medium, high]$
- $D(A_2) = [yes, no]$
- $D(A_3) = [2\_or\_less, 3, 4, more\_than\_4]$

# Formalization - DEX

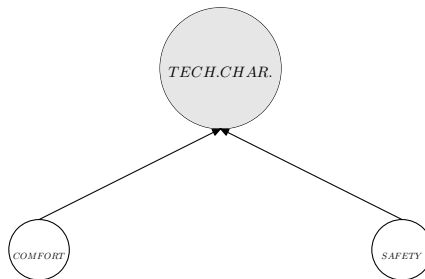
## Aggregated attribute



- Aggregated attribute  $A$ :
  - logical combination of lower level attributes. . .
  - . . . , into a higher level concept.
- Total aggregation function (defined by a table)  
 $F_A : D(A_1) \times D(A_2) \times \dots \times D(A_n) \rightarrow I(D(A)).$

# Formalization - DEX

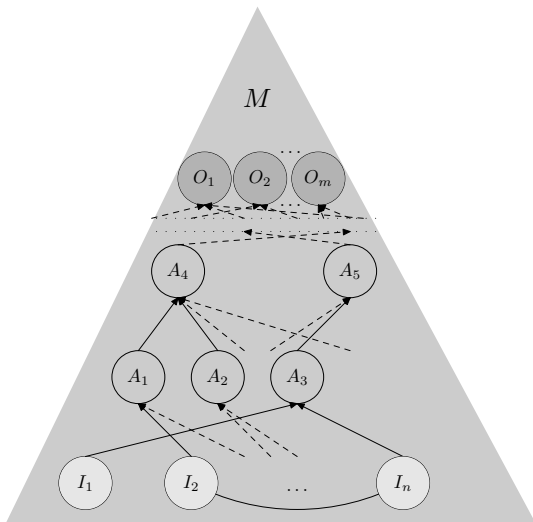
## Aggregated attribute - Function example



	COMFORT	SAFETY	TECH.CHAR.
1	small	small	bad
2	small	medium	bad
3	small	high	bad
4	medium	small	bad
5	medium	medium	acc
6	medium	high	good
7	high	small	bad
8	high	medium	good
9	high	high	exc

# Formalization - DEX

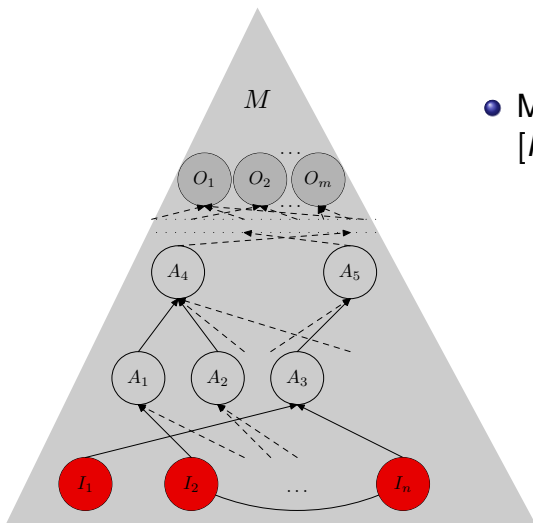
## Model





# Formalization - DEX

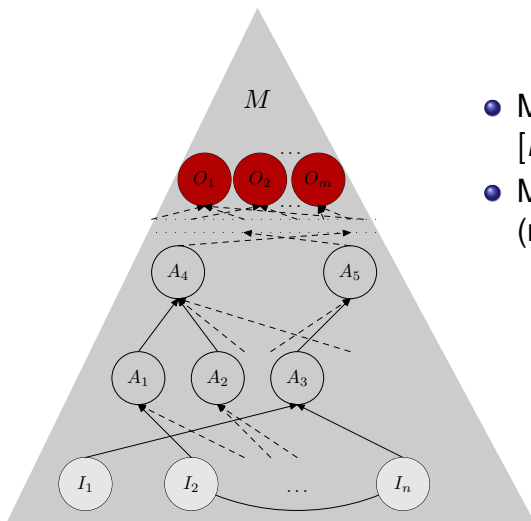
## Model



- Model input attributes  
 $[I_1, I_2, \dots, I_n]$

# Formalization - DEX

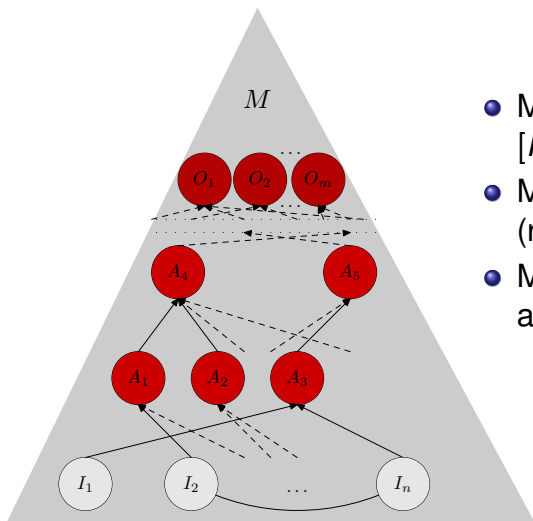
## Model



- Model input attributes  
[ $I_1, I_2, \dots, I_n$ ]
- Model output attributes  
(roots) [ $O_1, O_2, \dots, O_m$ ]

# Formalization - DEX

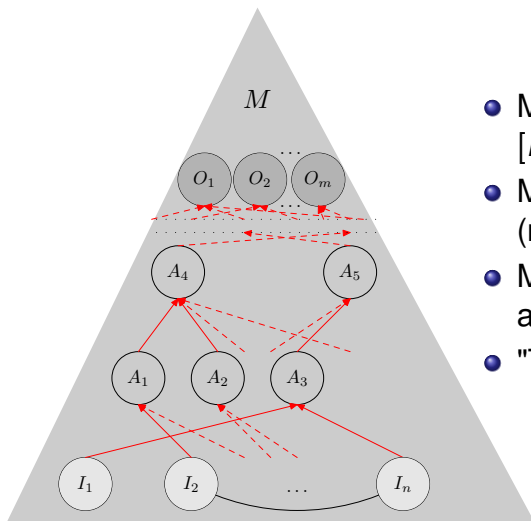
## Model



- Model input attributes  $[I_1, I_2, \dots, I_n]$
- Model output attributes (roots)  $[O_1, O_2, \dots, O_m]$
- Model aggregated attributes  $[A_1, A_2, \dots, A_k]$

# Formalization - DEX

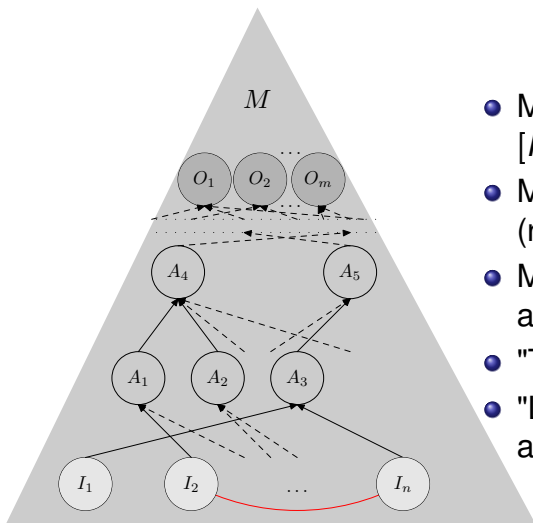
## Model



- Model input attributes  $[I_1, I_2, \dots, I_n]$
- Model output attributes (roots)  $[O_1, O_2, \dots, O_m]$
- Model aggregated attributes  $[A_1, A_2, \dots, A_k]$
- "Tree" of attributes

# Formalization - DEX

## Model



- Model input attributes  $[I_1, I_2, \dots, I_n]$
- Model output attributes (roots)  $[O_1, O_2, \dots, O_m]$
- Model aggregated attributes  $[A_1, A_2, \dots, A_k]$
- "Tree" of attributes
- "Links" between attributes

# Qualitative relational models

## Motivational example

### Evaluation of a company

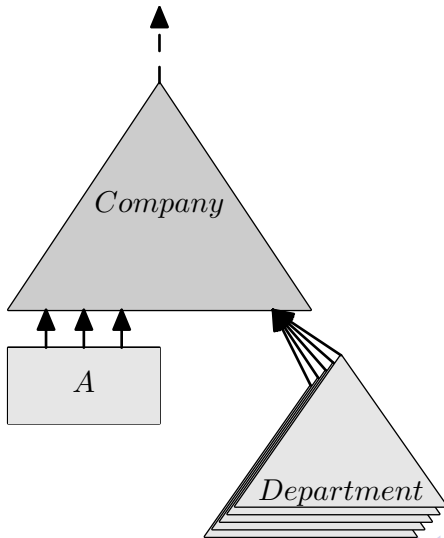
- Company consists of many departments
- Each department has to be evaluated. Each evaluation has to contribute to the final evaluation of a company.
- A company also has other "non-relational" attributes: Stock price, credit standing, number of buildings, number of employees, etc.

### What is needed

- One model for evaluation of  $n$  departments
- Aggregation of  $n$  values into one single value
- One model for evaluation of the whole company

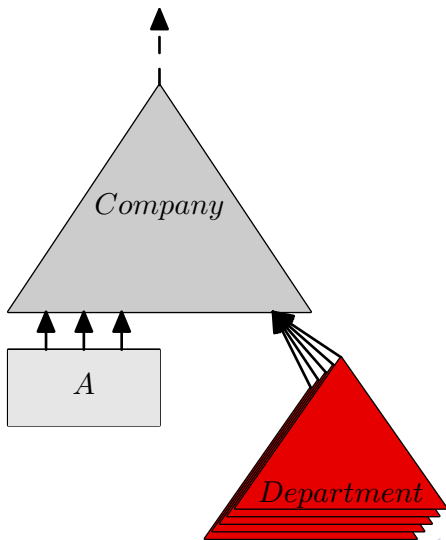
# Qualitative relational models

## Motivational example



# Qualitative relational models

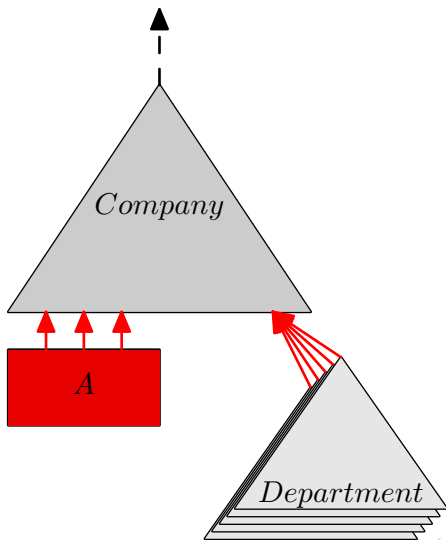
## Motivational example





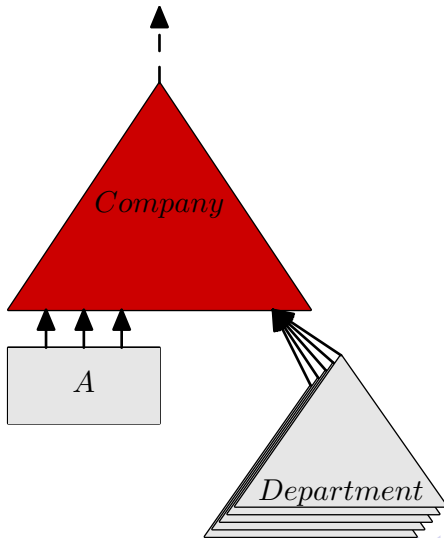
# Qualitative relational models

## Motivational example



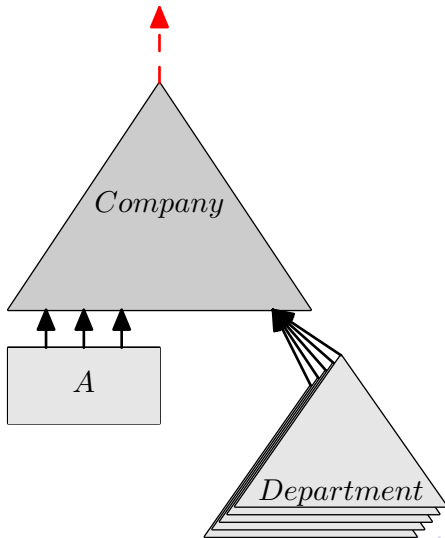
# Qualitative relational models

## Motivational example



# Qualitative relational models

## Motivational example



# Qualitative relational models

## Definition

A decision problem/alternative has the *Relational property* when it is composed of arbitrary number of similar sub-components.

- Many decision problems have relational properties.
- For example:
  - Evaluation of a company;
  - Assessing reputational risk of a bank.
- In DEX, relational problems were so far solved by ad-hoc manual or programmatic manipulation of models.
- We propose an extension to DEX methodology.

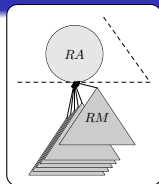
# Qualitative relational models

## Relational aggregated attribute

- Relational aggregated attribute  $RA$ :
  - a special type of attribute.
  - it is placed as a model input.
  - has an input from arbitrary number ( $m > 0$ ) of aggregated attributes belonging to some other relational model.
  - has one output.
  - Function

$$F_{RA} : (D(I_{RA,1}) \times D(I_{RA,2}) \times \dots \times D(I_{RA,m}))^n \rightarrow D(RA).$$

- When  $m = 1$ ,  $F_{RA}$  is typically a mathematical function: min, max, *mode* or *median*. We can compute a distribution, set or interval over  $n$  values.
- In general case, a custom function needs to be defined.



# Qualitative relational models

- The qualitative relational model extension has been implemented and along with a qualitative use-case presented at a conference.

- 1 Trdin, N., Bohanec, M.: Relational multi-attribute models in DEX methodology. V: 22nd International Conference on Multiple Criteria Decision Making, 17-21 June 2013, Malaga, Spain. MCDM Malaga 2013. [S. l.: s. n.], 2013.

# Numeric attributes

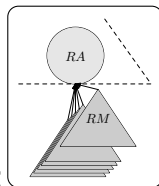
- More and more decision problems include qualitative and quantitative attributes.
  - There is a need to aggregate such attributes.
- 
- 6 "basic" function types!
  - The most problematic functions are the ones with qualitative and quantitative input attributes.

## Addition

The domain of each attribute  $D_i$  can now also be of numeric type (integer or real). The domain type is determined by the decision maker.

# Numeric relational models

## Numeric relational aggregated attribute



- Numeric relational aggregated attribute  $RA$ :
  - Function
 
$$F_{RA} : (D(I_{RA,1}) \times D(I_{RA,2}) \times \dots \times D(I_{RA,m}))^n \rightarrow D(RA).$$
- When  $m = 1$ ,  $F_{RA}$  is typically a mathematical function. Additionally to *min*, *max*, *mode* and *median*, we can compute *mean*. A distribution, set or an interval over  $n$  values can also be computed.
- In general case, a custom function of  $n$  numeric variables needs to be defined.



# OVJE

## Sustainability assessment of electric energy production technologies

- Sustainability assessment of electric energy production technologies in Slovenia with emphasis on nuclear technology.
- National project with an industrial partner.



Kontić, B., Kontić, D., Zagorc, S., Marušić, M., Dermol, U., Bohanec, M., Trdin, N.: Ocena vzdržnosti za razvoj energetike v Sloveniji do leta 2030 s poudarkom na jedrski tehnologiji. Book 1, (JSI work report, 11583). 2014.

# OVJE

## Modeling

- Two models:
  - ① For evaluation of electricity production technologies.
  - ② For evaluating a mix of electricity production technologies.
- Model (1): Evaluation of particular technology in general.
- Model (2): Evaluation of a technology mix, provided a mix of 8 technologies.
- Model (2) was also used for evaluation considering 6 events, from now till year 2050.
- Several attributes from model (1) were relationally connected to model (2).

# OVJE

## Overview of features used

- Mostly qualitative attributes and qualitative rule-based functions are used.
- Three numeric attributes are used for computing the weight of particular technology in the mix.
- Relational aggregation for assessing the evaluation of mix (used as input to model (2)).
- Distributions are used as inputs and also during evaluation.

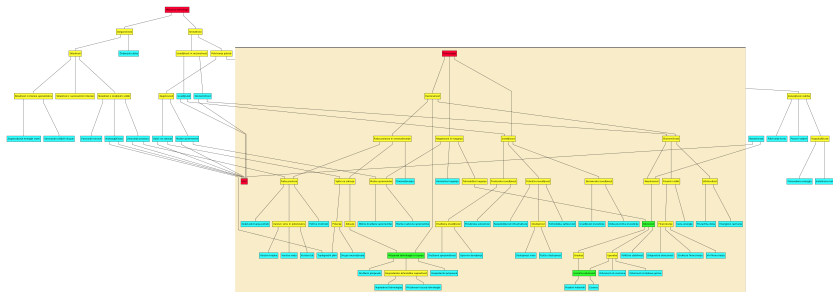
# OVJE

## Relational aggregated attributes

- 8 relationally aggregated attributes.
- Each has two inputs: (1) numeric and (2) qualitative:
  - ① Contribution (weight) of each technology in the mix, based on the *power output* and *produced energy*.
  - ② Certain important attributes from model (1): feasibility, health effects, carbon emission, etc.
- Aggregation is done by weighting each evaluation (from model (1)) with its corresponding weight. Generally, a distribution is output.

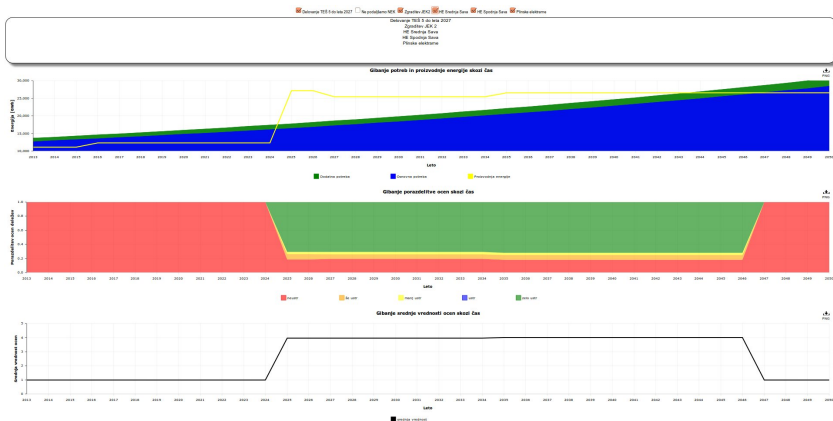
# OVJE

## Relational model



## OVJE

## Online evaluation view



Available on: <http://nejctrdin.com/ovjeGEN/>

# Conclusion

- DEX methodology
- Qualitative and numeric relational models
- Use-case for utilization of numeric relational models