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Book review

Evaluation and decision models: a critical perspective

D. Bouyssou, T. Marchant, M. Pirlot, P. Perny, A. Tsoukias, P. Vincke, (Ed.); Kluwer Academic Publishers, Boston/London/ Dordrecht, 2000, 274p. +viii

This is a rather unusual book on decision-making written by a group of scholars from Belgium and France. This is neither a monograph (that is, a research compendium) nor a tutorial volume. It is much more, a long discussion on the theoretical and practical aspects of decision sciences, with a view to emphasize two points: formal methods are needed to help decision-makers make rational choices; but any formal method has its own pitfalls and limitations, and should not be considered as a universal tool applicable to any decision problem. This point of view is the purpose of the introductory chapter.

The authors have not tried to present formal methods in detail. They systematically base their critical discussion on practical examples and elementary computations. The historical origin of methods is also pointed out. This approach makes this book attractive and easily read by non-mathematicians and especially by people involved in decision-making practice.

Chapter 2 is devoted to a critique of voting methods. It relies on the analysis of the French and the British voting systems. It shows paradoxical behaviors of both systems, and suggests that if a politician is elected using one method, it may be beaten using the other method.

Chapter 3 lays bare the arbitrary nature of grading methods in schools and universities. It explains that the process of defining a meaningful grading scale is far from obvious, let alone the issue of aggregating grades pertaining to distinct courses. The famous weighted sum method is not always capable of expressing any aggregation mode, and especially forbids interaction between criteria. The approach consisting in assigning qualitative grades (such as letters), translating them into arbitrary numbers, and performing their weighted average is especially pointed out as notoriously inconsistent. Namely, any change in the numerical encoding may lead to preference reversal effects, that is, altering the ranking of students obtained through numerical aggregation schemes.

Chapter 4 points out the limitations of statistical indicators such as I. Q., Dow Jones, air quality index, poverty index and the like. It demonstrates the fact that many of these indices are based on debatable measurement assumptions and arbitrary scale transformations, which severely hampers their meaningfulness. While they remain interesting indicators, they hardly capture all facets of the reality they are supposed to account for. The example of ranking athletes in decathlon competitions is especially enlightening, as a case where many adjustments to the performance indicator were introduced so as to tackle paradoxical behaviors of obvious measurement and aggregation schemes.

Chapter 5 points out the weakness of the famous cost-benefit analysis which is often claimed to be the only rational approach to investment decisions, such as budget allocations, building new

- 1 roads, new hospitals and so on. It is shown that
 2 CBA takes a very narrow view on the problems
 3 they address. It is again based on a simplified view
 4 of reality. For instance parameters involved in the
 5 formal model, such as the social discount rate, are
 6 not so easy to determine. Even worse, the theo-
 7 retical foundations of CBA reveal that it should
 8 be restricted to the study of marginal changes in
 9 the economy. In practice, it is however used for
 10 evaluating the consequences of important struc-
 11 tural changes in the addressed system (hence a
 12 non-marginal change). Another tricky issue is the
 13 systematic use of money substitutes, like the cost
 14 of human life. Such a cost is for instance very
 15 much country-dependent, which is ethically ques-
 16 tionable.
- 17 The longest chapter of the book is devoted to
 18 a comparative study of multicriteria decision-
 19 making methods. There is a very large body of
 20 literature devoted to rational decision based on
 21 several aspects or attributes. Roughly speaking
 22 there are two groups of approaches: those re-
 23 lying on numerical estimates and aggregation
 24 operations, and those based on the use of rela-
 25 tions for the modeling and aggregation of prefer-
 26 ence information. Interestingly, the first group is
 27 popular in America, while the other group was
 28 basically developed in Europe. Various methods
 29 are compared on the basis of a single example of
 30 buying a sports car based on cost, acceleration
 31 pick up of the engine, brakes, and road-holding
 32 behavior. Methods considered are the weighted
 33 average of attribute-values, multicriteria util-
 34 ity theory, Saaty's analytic hierarchical process
 35 (AHP), and the outranking methods initiated by
 36 Roy and colleagues.
- 37 The car choice problem is first solved by in-
 38 tuitive considerations of a real person who did
 39 make a decision, and bought the car. Then, formal
 40 methods are used and their results compared to
 41 the choice made by this person. In the framework
 42 of numerical methods, it is shown that the mean-
 43 ing of criteria weights in weighted aggregations is
 44 problematic. Namely any change in measurement
 45 scales affects the order of magnitude of weights,
 46 even when restricting to weighted averages. This
 47 issue is especially critical if attribute values are
 48 aggregated without proper rescaling. The issue of
 49 numerical encoding of qualitative attribute val-
 50 ues is again a tricky one. The merit of multicri-
 51 teria utility theory is to properly address scaling
 52 problems, while at the same time distinguishing
 53 between values in the attribute scale, and
 54 decision-maker preference pertaining to these
 55 attribute values. The notion of utility function is
 56 tailored for laying bare this distinction, and par-
 57 tially solves difficulties of a blindly performed
 58 weighted average. The AHP method can be
 59 viewed as a systematic use of utility theory in a
 60 recursive way through a hierarchy of criteria. It
 61 proposes a technique for assessing weights in the
 62 weighted average of utility values. Unfortunately,
 63 it is shown that this techniques relies on an ar-
 64 bitrary translation of verbal levels of pairwise
 65 preference into numerical values (1,3,5,7,9). It
 66 creates significant differences between AHP and
 67 multicriteria utility theory. Especially, utility the-
 68 ory is based on an interval scale and leaves room
 69 for assessment methods based on indifference
 70 judgments. However the AHP is based on an
 71 absolute scale, and the debatable assumption that
 72 weights can be assessed by means of the same
 73 procedure at any level of the hierarchy. One
 74 weakness of multicriteria utility theory is its in-
 75 formational burden: the decision-maker is asked
 76 many questions and it is not clear that all answers
 77 can be provided. Also all attribute scales are
 78 supposed to be continuous (which is reasonable
 79 under the assumption that any relevant aspect
 80 of the decision-process can be expressed as a
 81 cost).
- 82 In practice, the available information supplied
 83 by decision-makers can be very poor and some
 84 attributes are more qualitative than quantitative,
 85 because they simply do not refer to any objec-
 86 tively measurable entity. In such a situation, it
 87 looks more appropriate to represent preference
 88 information along each attribute by means of

1 some sort of ordering relation comparing the mer-
 3 its of alternatives on a pairwise basis according
 5 to the decision-maker opinion. Local rankings
 7 of alternatives for each attributes are obtained.
 9 Global rankings are obtained using voting tech-
 11 niques. A decision outranks another one if it is
 13 better than the latter for a sufficient number of
 15 attributes.

17 This crude scheme is actually improved by
 19 means of weights attached to attributes, and pos-
 21 sibly veto thresholds that prevent an alternative
 23 with a very bad evaluation on some attribute from
 25 outranking alternatives that are less attractive for
 27 other attributes. One difficulty of this approach is
 29 that it inherits all technical difficulties of voting
 31 methods, especially, local rankings are aggre-
 33 gated into a global outranking relation that does
 35 not necessarily provides a global ranking of al-
 37 ternatives in the end. This is due to the possibility
 39 of cycles in the final relation, due to Condorcet-
 41 effect, or the presence of incomparable alterna-
 43 tives. Whether such possibly poorly informed
 results are a good or a weak point actually de-
 pends on the application context.

45 *Chapter 7* is of special interest for the read-
 47 ers of Fuzzy Sets and Systems as it proposes a
 49 discussion of fuzzy rule-based systems from the
 51 standpoint of decision making. While the authors
 53 acknowledge the merits of translating symbols
 55 appearing in rules by means of fuzzy intervals,
 57 they also point out that all the scaling difficulties
 59 encountered in multicriteria decision-making are
 61 met in fuzzy interpolative reasoning as well. The
 63 purpose of fuzzy sets is to make unrelated entities
 65 commensurate via membership functions. How-
 67 ever this should be carried out with much care.
 69 Similar difficulties are pointed out in fuzzy ver-
 71 sions of the k -nearest neighbor rule for classifi-
 73 cation purposes, even if the practical merits of
 75 these fuzzy methods are emphasized by the au-
 77 thors. They also report on an application to the
 79 control of ovens for cooking biscuits, where both
 81 fuzzy k -NN algorithms and fuzzy control tech-
 83 niques are conjointly used.

85 *Chapter 8* discusses the importance of mod-
 87 eling and accounting for uncertainty in decision
 89 processes involving time and repeated decisions.
 91 The illustrative example is a case study in elec-
 93 tricity production planning. It is shown that the
 95 classical expected utility criterion can be very dif-
 97 ficult to apply in practice. However the use of
 other techniques may lead to new difficulties like
 dynamic inconsistencies and may fail to select
 non-dominated strategies.

99 *Chapter 9* discusses a real-world case-study
 101 in software evaluation. The originality of this
 103 chapter is to adopt the point of view of the cus-
 105 tomer and to present the evaluation of the results
 107 of the study by the customer. It emphasizes the
 109 fact that the problem-formulation step is abso-
 111 lutely not a trivial matter, and that the evaluation
 113 model must take into account the value system
 115 of the customer. If the decision-maker cannot
 117 understand the decision-process he is involved
 119 in, the proposed method even if sophisticated
 121 and theoretically founded, will be rejected as
 123 unsuitable. This study also points out the ne-
 125 cessity of exploiting the available information
 127 in a meaningful way, that is, one should avoid
 129 introducing arbitrary precision, and the method
 131 should correctly reflect the nature of the rating
 133 scales.

135 Overall, this book points out that despite their
 137 limitations, formal methods should be used in
 139 decision-making in order to better understand
 141 why an alternative is better than another. For-
 143 mal methods force decision-makers to better
 145 justify their choices, and promote communi-
 147 cation between various actors of the decision
 149 process. However by systematically pointing
 151 out pitfalls of the various existing approaches,
 153 the book strongly suggests that no approach is
 155 perfect, and that being aware of such limita-
 157 tions leads to a better, less naïve, use of these
 159 approaches.

161 As a matter of fact, it has been often assumed
 163 that the use of fuzzy sets can cope with the lack
 165 of objective attribute scale in decision-making

1 problems. Considering attributes such as com-
 2 fort, trust-worthiness and the like, some authors
 3 have modeled linguistic terms pertaining to such
 4 attributes by fuzzy numbers on the unit interval,
 5 where a value in the unit interval represents a
 6 level of comfort, trust-worthiness, etc. It is often
 7 found that fuzzy number-extensions of weighted
 8 averages are used to perform aggregation of
 9 linguistic values pertaining to such complex,
 10 non-numerical attributes; fuzzy number rank-
 11 ing methods are then used to rank alternatives.
 12 These techniques look rather naïve and suffer
 13 from the same difficulties as some of the methods
 14 discussed and criticized in this book: arbitrary
 15 numerical encoding of linguistic levels, improper
 16 scaling, meaninglessness of weights and so on.
 17 The use of fuzzy numbers instead of precise value
 18 is somewhat delusive, all the more so as final
 19 rankings of alternatives are obtained via defuzzi-
 20 fication schemes. In a nutshell, changing arbitrary
 21 numerical values, in an arbitrary numerical scale,
 22 into fuzzy intervals covering such a scale does
 23 not make obtained results more valid nor robust.

Reading this book could be beneficial to fuzzy
 25 decision-making scholars, because it would help
 26 them assess the merits and limitations of their
 27 fuzzy methods, often developed out of the main
 28 streams of decision research, and too seldom
 29 compared to established methodologies. The non-
 30 mathematical presentation of this book contrasts
 31 with the strength of its message, and recom-
 32 mends it to the attention of applied researchers in
 33 decision-making who used fuzzy set-based meth-
 34 ods in case-studies. This book can be the bridge
 35 they need to cast their favorite fuzzy methods in
 36 the landscape of multicriteria decision-making
 37 methods. For this purpose, the impressive bibli-
 38 ography can be used as a starting point for further
 39 readings.

Didier Dubois 39

I.R.I.T. 41

Institut de Recherche en
Informatique de Toulouse 43

France

E-mail address: didier.dubois@irit.fr 45