

Supplementary Appendix to the publication: Marcot, B. G., M. P. Thompson, M. C. Runge, F. R. Thompson, S. McNulty, D. Cleaves, M. Tomosy, L. Fisher, and A. Bliss. 2012. Recent advances in applying decision science to managing national forests. *Forest Ecology and Management* 285:123-132.

Supplementary Appendix. Tools and approaches useful in stages of structured decision-making, with examples of applications. Many tools or approaches can serve more than one stage. Areas of uncertainty addressed by each tool or approach (sensu Ascough et al. 2008): LU = linguistic uncertainty, KU = knowledge uncertainty, VU = variability uncertainty, DU = decision or preference uncertainty.

| Name of tool or approach | Use and type of uncertainty addressed | Examples of application |
|----------------------------------|--|--|
| Problem Structuring Stage | | |
| Cognitive Mapping and Modeling | Organizes and synthesizes system components and dynamics. LU, KU | Mendoza and Prabhu, 2005 (participatory modeling and sustainable forest management); Wolfslehner and Vacik, 2011 (forest management sustainability evaluation) |
| Influence diagrams | Represents key system parameters, decision points, and outcomes in a qualitative graph. Can be further developed into other quantitative model types (e.g., state and transition models, Bayesian network). LU, KU | Bashari et al., 2009 (rangeland management) |
| Decision tree | Diagrams choices, outcomes (utilities), and probabilities to evaluate expected values of alternatives; evaluates knowledge and preference (risk attitude) uncertainties; useful for all SDM stages. KU, VU, DU | Failing et al., 2004 (adaptive management); Wan et al., 2009 (vegetation modeling) |
| Objectives hierarchy analysis | Helps resolve conflicting objectives, social values, and preferences. VU, DU | Maguire et al., 2004 (invasive species management) |
| Problem Analysis Stage | | |
| Simulation modeling | A broad set of tools useful for modeling system dynamics and response to management, e.g. timber growth and yield, wildfire, hydrology, climate change, weather. VU, DU | Krawchuk and Cumming, 2011 (forest fire under climate change); Vuilleumier et al., 2011 (invasive species control) |
| Bayesian networks | Models the conditional dependence between variables accounting for prior knowledge. KU, VU | Aalders, 2008 (land-use decisions); Dlamini, 2010 (fire risk analysis), |

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|--------------------------------------|--|--|
| Data mining | Analyzes relationships between numerous data fields in an existing database, gaining new knowledge. KU | Dlamini, 2011 (vegetation mapping) |
| Fuzzy logic, fuzzy set theory models | Allows computation of vague and uncertain data using a membership function for data inputs. LU, KU, VU | Glenz et al., 2008 (flooding impact on woody species growth); Reeves et al., 2006 (evaluating watershed condition and aquatic habitat) |
| Rough set theory | Unknown values for data are represented by their approximated lower and upper bound. KU, VU | Xie et al., 2011 (land cover data retrieval) |
| Analytic Hierarchy Process (AHP) | Hybrid approach allowing for imprecise and vague definitions embedded within a hierarchy. Allows for joint consideration of objective and subjective information with expert judgment. KU, VU | Coulter et al., 2006 (forest roads); Hessburg et al., 2007 (wildfire danger, fuels treatments), |
| Analytic Network Process (ANP) | Better for expert judgment use and capturing feedbacks and interdependencies, relative to AHP. KU, VU | Bottero et al., 2011 (wastewater treatment assessment); Wolfslehner et al., 2005 (sustainable forest management) |
| Rule and network induction | Results in rules or networks based on the relationship between a given set of attributes; networks can then be further developed as probability transition models or Bayesian networks. LU, KU, VU | Berger, 2004 (crop suitability) |
| Neural networks | Allows modeling of nonlinear and unknown relationships. KU, VU | Ejrnaes et al., 2002 (habitat quality); Scrinzi et al., 2007 (forest distribution data) |
| Reliability analysis | Assessment of the potential failures (probabilities and timing) of a system and their effects. VU | Chowdhury et al., 2009 (drinking water contaminants) |
| Scenario analysis | Considers multiple outcomes providing a range of alternatives and their likelihoods. KU | Bohnet et al., 2011 (sustainable landscape development) |
| Comparative risk assessment | Extends traditional risk assessment to include decision space available to managers and stakeholders to allow them to explore tradeoffs between alternative courses of action. VU, KU | Ager et al., 2007 (fuel treatment strategies); Calkin et al., 2011 (wildland fire management) |

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| Decision Point Stage | | |
| Valuation & Cost-Benefit Analysis | A family of stated and revealed preference models for establishing the value of non-marketable goods and services. VU, DU | Champ et al., 2010 (hedonic pricing model and homebuyer wildfire risk perceptions); Holmes et al., 2004 (contingent valuation and riparian restoration), |
| Exact Optimization Methods | A variety of mathematical techniques that can identify a set of non-dominated alternatives or a single best answer. Includes linear programming, nonlinear programming, integer programming, others. VU, DU | Thompson et al., 2010 (forest road erosion control); Toth et al., 2009 (spatial harvest scheduling with habitat objectives) |
| Heuristic Optimization Methods | Iteratively update solution(s) through process of information exchange, self-adaptation, and competition; entails perturbing decision vector, accepting and retain new solution(s) according to various criteria. Includes evolutionary algorithms, genetic algorithms, simulated annealing, tabu search, others. VU, DU | Icaga, 2005 (water quality monitoring); Kennedy et al., 2008 (fuel treatment planning), |
| Multi-attribute utility theory (MAUT) | Defines a cardinal utility function according to all criteria, typically by defining performance of each. VU, DU | Merkhofer et al., 1997 (siting hazardous waste management facility); Moffett et al., 2005 (conservation planning) |
| Analytic Hierarchy Process (AHP) | Pairwise comparisons of attributes/criteria based on linguistic scale then converted to ratio-scale weights, which can be aggregated up through an objective hierarchy. LU, VU, DU | Darin et al., 2010 (invasive plant management); Wolfslehner et al., 2005 (sustainable forest management) |
| Simple Multi-Attribute Ranking Technique (SMART) | Assigns criteria weights on 0-100 scale, by scaling weights for all attributes relative to the most important attribute, assigned 100. DU | Kajanus et al., 2004 (tourism management and sustainable development); Reynolds, 2001 (salmon habitat restoration) |

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| Stochastic Multicriteria Acceptability Analysis (SMAA) | Family of methods designed to facilitate decision-making in contexts where both criteria and preferences may be subject to uncertainty; based on exploring the weight space in order to describe the preferences that would make each alternative the most preferred one, or that would give a certain rank for a specific alternative. VU, DU | Kangas et al., 2003 (forest management plan development); Kangas et al., 2005 (natural resource management) |
| Implementation and Monitoring Stage | | |
| Multimodel analysis | Multiple models for evaluating various representations of expert knowledge, scales, and variable interactions. KU, VU | Rehme et al., 2011 (general application) |
| Multi-agent systems | Models multiple interacting “agents” (programs, humans, or human teams), representing diverse interests, in role-playing scenarios. VU | Lynam et al., 2002 (rangeland management) |

References - Supplementary Appendix

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