Multicriteria Decision Analysis

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tul synthesis of methods. sequent cooperation led to insight on a higher level and fruitpolitical pragmatism was pitted against scientific ideals. Subcally opposed to each other. In a public confrontation, ment, the two ranked lists turned out to be almost diametriernment. We used the second method based on multicriteria decision analysis to review the first result. To our embarrass-The ranked list produced was backed by the Norwegian govbut was still intended to be formal and open to investigation. ranking 542 hydropower projects. Two methods were used, The official one was process-oriented rather than analytical The Norwegian master plan for water resources called for

construction costs and energy production the overall objective. Forecasts for the pensive and controversial ones. This was versial projects be developed before exhad demanded that cheap and uncontroplant projects. The Norwegian Parliament in Norway involved ranking 542 power he development of a master plan for the remaining hydroelectric sources

particular project. The problem then was transportation, climate, and reindeer ply, water pollution, agriculture, flooding landscape, recreation, wildlife, water sup which interests in such diverse areas as collected data indicating the degree to tion, the Ministry of Environment had of each project were available. In addiherding would be affected by any

GEVERNMENT POLICIES

DECISION ANALYSIS -- APPLICATIONS

MANKING POWER PROJECTS

sulting ranked list would then be apused by the bureaucracy to monitor the proved by the Parliament and would be to develop consistent and acceptable rankactual development of new hydroelectric part of a "portfolio" of projects. The re-_{uated} on its own merits rather than as subobjectives. Each project was to be evaling criteria to account for all the implied objectives to be economy and little conflict potential. Accordingly, the Ministry

Background and Mandate

year) of a total potential of 173 TWh/year TWh per year (trillion watt-hours per source of electric energy. As of 1984, 100 has been developed. falls. They have long been used as energy gources, and today they are the major Norway has an abundance of water-

ergy Administration were official the Norwegian Water Resources and En Ministry of Petroleum and Energy and responsibility for the project, and the The Ministry of Environment was given developed in time to meet this demand dentify enough projects that could be 2000, and the government wanted to ditional demand of 10 TWh by the year ones." Current prognoses predict an ad more expensive and more controversial sial projects can be developed before the economically sounder and less controver sources. The mandate was to rank hydroelectric power projects "so that the maining 73 TWh of viable hydropower for the possible development of the reliament therefore asked for a master plan hydroelectric power. The Norwegian Paropposition to further development of Recently, there has been mounting

It is not surprising that such a huge

project became controversial among politiwhat typical conflict between political cians and among scientists. This someantithesis, and synthesis. through a dialectical process of thesis, goals and scientific ideals was solved

The mandate prescribes the two major

economy and little conflict two major objectives to be potential The mandate prescribes the

were grouped into six classes. to prevent too much insight), the values seven percent, divided by yearly produc value of construction costs computed at ects, economy was expressed as present tion. As a hedge against uncertainty (or the 542 projects. For each of the 542 proj base containing descriptions of each of of Environment first established a data

climate, and to maximize benefits to and water temperature, to avoid changes to tation facilities (roads etc.), to control ice flooding and erosion, to improve transporprotect reindeer herding, to protect against historical siles, to protect agriculture, to adequate supply of drinking water to prohunding, to protect fishing, to provide an explicit objectives: to protect miture, to regional economy. tect against water pollution, to protect protect recreational activities, to protect Conflict potential was derived from 14

conflict associated with a subobjective For a particular project, the degree of

was measured on a subjective scale ranging from -4 to +4 (-4 indicates serious conflict, 0 no effect, and +4 very positive effects). Positive effects would occur when, for instance, the project provided flood protection or required new roads that improved transportation for isolated communities. The data were collected by 14 teams of experts. Scores were supposed to be comparable across projects. For instance, a score of -3 for nature on one project and a score of -3 for nature eal damage to nature was about the same.

sacrifices environment to get energy ent. By building a hydropower plant, one objective had been to select areas to bewhich should be accounted for by a There is a trade-off to be considered problems might be fundamentally differnot immediately understood that the two ideas to the hydropower problem. It was tore natural to try to apply the same more important than others. It was thereordering, where one objective is infinitely necessary. This is similar to lexicographic jectives. No trade-off analysis had been date, regardless of the scores on other ob automatically be a national park candiciently high score on one objective would be efficient, since an area with a suffiparks, subjective scales had turned out to on the basis of their uniqueness in one or come national parks. Areas were selected more respects. In the case of national mations. Earlier the ministry had success points and had to resort to gross approxi tive scales because they lacked anchor fully conducted a related task where the people felt uncomfortable with the subjec-During the data collection period, some

proper ranking procedure. Trade-off analyses weigh objectives, which is difficult without good scales. Having already spent \$10 million to collect data, however, the ministry could not be persuaded to do it again with objective scales.

The data base contains 542 economy scores between 1 and 6. For a particular project, the lower the figure, the less the construction costs per unit of energy produced. The data base also includes 542 times 14 scores between -4 and +4, one score for each of the 14 subobjectives. The lower the score, the more the project is in conflict with that subobjective.

These data indicate the social and economic costs associated with hydropower development.

The benefits were expressed by 542 energy production rates. They range from 1

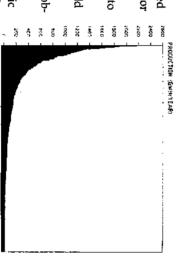


Figure 1: A bar chart of the energy production of the 542 projects considered in the master plan. To show the distribution of project sizes, the projects are ordered along the horizontal axis, each represented by a bar. The separate bars are hardly visible. Together they form a profile which reveals that a major problem of the project is to consistently rank a large number of insignificant projects and a small number of projects that are up to three orders of magnitude bigger.

HYDROPOWER SROJECTS

to 2,500 GWh (billion watt-hour) per year. The distribution of the 542 production rates is shown in Figure 1.

The Ministry's Ranking Method

According to the mandate, the ranking should achieve economy and should minimize conflict. This was interpreted literally: The more economical and the less controversial a project was, the higher its priority. Hence, two data reduction processes were performed: first, the 14 variables expressing conflicts with sub-objectives were reduced to one representing the overall conflict potential for each project; then, the economy index and the conflict potential were combined into a rank index.

class, the higher the conflict potential of project. The higher the consequence result was a number between 1 and 8. viable. Then the scores were totalled to This was called the consequence class of the how this was done is not available). The then combined (but exact information on indicate the general conflict potential of indicated whether the project was at all 14 subobjectives was counted. The result occurrences of -4 and -3 scores for the public). For a given project, two paramehoc procedure with the following general of a project, the Ministry adopted an ad the project. The two parameters were ters were calculated. First, the number of features (the details have not been made To compute the overall conflict potential

From a multi-criteria decision making point of view, the process is akin to using a multiplicative utility function where the attributes are treated as substitutes. The process did not discriminate between the

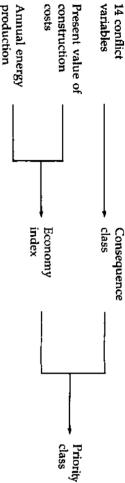
subobjectives, except for agriculture which was counted twice, the argument being that it consists of both forestry and farming. Explicit differentiated weights were avoided, thus giving most readers an impression of objectivity. In reality, of course, this process implicitly uses equal weights. Using equal weights is certainly more arbitrary than using carefully chosen differentiated weights. Nevertheless, by using a poorer set of weights, the Ministry was politically better off: they evaded the controversies that would have arisen had they tried explicit differen-

The last step was to combine the econ omy index and the consequence class to obtain a single priority score (Table 1).

Table 1 is akin to a two-dimensional utility function which assigns a priority class to any project, based on a combination of economy and its classifications for consequence. The lower the cost of the energy produced and the more limited the project's adverse effects, the lower is its priority class figure. A low priority class means that the project has high priority. For example, Project A is

Priority Class	E6	U	<u>F</u> 4	<u>E</u> 3	ij	E		
	Sī	4	ω	2	_	-	<u>~</u>	
	5	4	w	2	<u>~</u>	ĭ	্র	Conseque
	6	Ü٦	4	ω	Ŋ	2	3	
	7	6	6	4	Ç,	Ç	조	
	9	œ	7	6	٥ı		ሯ	nce
	1 1	10	9	00	7	7	K6	Class
	13	12	11	10	9	9	K 7	
	16	15	14	13	12	12	K8	

Table 1: The priority class is found by combining the economy index (E1... E6) and the consequence class (K1... K8) of a project. The priority class (P1... P16) scores are inside the matrix.



hydropower project are reduced to a priority score. Figure 2: In the ministry's data reduction process, 16 variables that completely describe a

to priority class 7 and hence is ranked inexpensive (E1) but has a greater potenit belongs to priority class 6. Project B is arouse conflict (K3). According to Table 1, atter project A. tial to produce conflict (K6). It is assigned expensive (E6) but has little potential to

priority. Figure 2 summarizes the projects and assigning them a reasonable Ministry's ranking method. tic basis by evaluating some well-known The table was constructed on a heuris

The Ministry's Ranking Method Is

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sumption, one may conclude that the projects in isolation, we look at their ef tended. However, small projects will be with the mandate, is actual irrational. seems reasonable and appears to conform ministry's ranking method, although it it is rational to choose A. Using this asters you more for the same price than B efficiency; if you are insatiable and A ofdoes not control the cumulative damage tect nationally, we see that the method favored. If instead of considering single troversial will get high priority, as incheap per GWh and is by itself uncon-Look again at the table. A project that is One basic tenet of rationality is that of

> sum of damages will be larger than necessary for any given production level. duce a ranking list where the nationwide of many small projects! It is likely to pro-

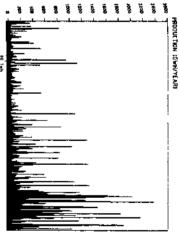
class, E4 and K4. and the Staurset project, as both having actly so. For example, the ministry classi the same economy class and consequence fied two projects, the Otta/Lagen project As a matter of fact, it turned out ex-

given the same priority. spect to the preference rating scheme conflict potential (which is an absolute (Table 1) and, accordingly, they were therefore considered identical with remeasure, not relative to GWh). They are the same costs per GWh and the same Both projects were judged as carrying

duces 12. This information never entered GWh/year whereas Staurset only prothe ranking process. However, Otta/Lågen produces 1,117

The Government's Proposed Master Plan

classes P1-P4. Figure 3 is a bar chart ergy supply of approximately 10 TWh the 542 projects in the order in which showing the energy production of each of This corresponds to the first four priority 153 projects to produce an additional en The ministry ended up with a list of



height indicates the project's energy producordered according to the ministry's ranking Figure 3: The bar chart shows the 542 projects indicating low priority for these projects. list. Each bar represents one project, and its tion. Big projects tend to appear to the right,

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negative consequences if the list were to the bars representing consequence classes ects in the same order as Figure 3, with projects are given the most favorable ing each project. It is obvious that small they were ranked, with a bar represent-TWh-mark visualizes the national sum of The black area to the left of the 10 priority ranking. Figure 4 shows the proj

10 TWh expected to be needed by the projects and a large number of almost inthe proposed master plan: A few large prorities, making it necessary to build a significant projects were given the highest large number of projects to generate the Figures 3 and 4 reveal the essentials of

Keception of the Master Plan Proposal

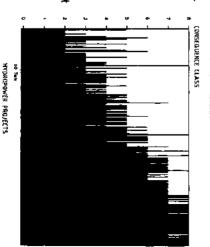
generally well received by politicians and Procedure. Not so. The proposal was pased as it is on an irrational ranking proposal would be rejected immediately One would think that the master plan

> spokesmen and the Norwegian Water and environmentalist organizations. Industry Electricity Board, however, disliked it.

consistencies. The big picture was hidden by details. needed to discover its methodological inproposed plan, nor the analytical skill to comprehend the total impact of the The politicians had neither the insight

well distributed, and no single conflict Since the projects were geographically cerned with possibilities for conflict. were satisfied. threatened to become overwhelming, they The politicians were primarily con-

Environment, they probably thought it matter of principle. Besides, since the they prefer smaller power stations as a that "small is beautiful," and therefore was in safe hands. project was directed by the Ministry of Environmentalists traditionally advocate



damage that would be inflicted if 10 TWh were ranked list. to be developed according to the ministry's ated with that project. The black area to the bar now indicates the conflict or damage associthe same order as in Figure 3. The height of a Figure 4: A bar chart with the 542 projects in left of the 10 TWh mark shows the nationwide

July-August 1988

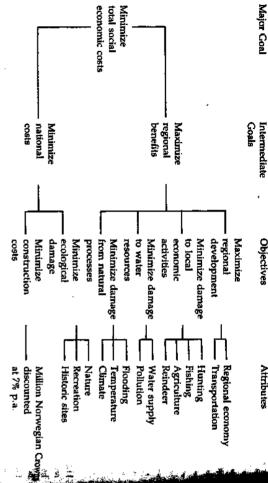


Figure 5: The goal hierarchy used to construct a decentralized utility function in the alternative analysis. All objectives are per energy unit.

Industry's primary concern was that building many small power stations was likely to involve delays, and they feared that this would cause a shortage of energy in the near future.

BMHOLIT IN

The Water Resources and Energy Administration was most insightful on the subject. They were also the most critical and voiced a suspicion that the implied nationwide damage was unnecessarily large. We were at the time members of a scientific advisory board on methodology for the project. Being vocal critics of the work done so far, we were engaged to perform an alternative analysis.

The Alternative Analysis

We were alloted neither time nor money to collect better data. We had to rely on the same data base as the ministry. We decided to use the classical MCDM approach of Keeney and Raiffa

[1976]. We first constructed a goal hierarchy (Figure 5).

utility functions. In addition, we confive independent regional multiplicative. swers. We used the answers to construct group of three to four persons were interway into five regions. From each region, a attributes. We did this by dividing Norent from each other. The ministry's use was that we established weights for these sues. One of the results of the interview sion authority for regional issues and at archy. Thus we could decentralize deci-# structed one national utility function forcomputer-interactive questions and anviewed during a half-day session with gard to the importance of the 11 regional 15 attributes that were significantly differ the same time centralize it for national the national objectives in the goal hier is low for geographical differences with re-We structured the goal hierarchy to al-

> and weights had been a poor approxton. Another result was regional diftes. Climate, transportation, and control appeared to be more imporfif the western and northern parts of country where living conditions are precarious. Recreation and agricultended to be emphasized in the more att southern and eastern parts.
>
> Were not able to fully carry through ambitious program, however, because or factors disrupted the project.

Alternative Ranking Method
bur ranking method was as follows:
gused the (hierarchical multiplicative)
but function to calculate the total utilgreach project based on the 15 variatice all 15 variables represent some kind
social or economic cost associated with
project). Energy production is not yet
hided. To account for it, we calculated
be social and economic costs per energy
it produced [Wenstöp 1983]:

As we saw it, our method was rational would lead to a master plan with the rest social and economic costs per entry unit produced, seen on a national the. When we applied our ranking crita, however, we came up with a list of seven projects (compared to the govern projects (compared to the govern projects appeared to be about one-that of that of the official proposal.

Project is Aborted — and Started

ther seeing the results of our ranking thod, the Water Resources and Energy ministration abruptly dropped the

project. From their point of view, our highest ranked projects were politically impossible. Therefore, they reasoned, a method which produces such results is clearly not suitable. We were, however, given two days to come up with new information that might make them reconsider their decision.

We could find no errors in the method and we concluded that something must be wrong with the data. Exploratory data analysis produced an interesting diagram

In Figure 6, the vertical axis shows the sum of the 14 conflict numbers, an approximate measure of the damage or conflict associated with each project. As the figure shows, the data base clearly under estimates the damage associated with larger projects. This problem could be

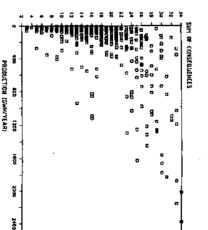


Figure 6: Data analysis of the relationship between estimated damage and energy production. Each dot in the diagram represents a project. The sum of consequences, a measure of the conflict or damage associated with a project, is evidently only weakly related to th size of the projects. The graph made people a the Water Resources and Energy Administration immediately realize that the data base scriously underestimated the damage associated with large projects.