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Decision making model development in increasing wind farm energy efficiency

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1	DECISION MAKING MODEL DEVELOPMENT in INCREASING WIND
2	FARM ENERGY EFFICIENCY
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11 Abstract

Renewable energy is a significant input for environmental, economic and social development. 12 The wind energy has become the quickest thriving renewable energy resource. It is worth noting 13 that wind power has the least emissions and lowest water consumption, but it has comparatively 14 high costs. Thus, making wind energy station planning decision requires an operation of 15 balancing various technical, economic, ecological, and environmental aspects over time and 16 space. This paper is constructed to choose a convenient turbine from various perspectives for 17 developing a wind energy station. For 2 MW, the best wind turbine brands are listed based on 18 expert interviews and literature review and they are used to establish a decision-making model 19 with four main criteria consisting technical, economic, environmental, and customer attributes 20 with various sub-criteria. Determining the related criteria and grouping them in main categories is 21 the novel approach provided by this research. The constructed model can be solved by various 22 multi-criteria decision making techniques. The selection of the best wind turbine is determined by 23 using AHP technique. The results are significant both from engineering and economic 24 perspective as the applied methodology is practically implementable and commercially viable. 25 Accurate and up-to-date data are obtained from leading companies in the industry. 26

Keywords: AHP, Wind turbine select, Renewable energy, Energy efficiency, Multi-criteria
decision making.

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Abraviations used: AHP, Analytic Hierarchy Process; TOPSIS, Technique for Order Preference by Similarity to Ideal Solution.

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1. Introduction

Among renewable energy resources, wind energy is one of the most profitable, clear and 37 powerful way to supply the applications of renewable energy [1], during the time that the 38 generation of the wind energy has increased 32% per year in the past 10 years [2]. The potential 39 for wind electricity generation around the World is displayed in Fig. 1 [3]. Fig. 2 shows the top 40 15 countries by total wind installations [4]. The wind energy station planning effort requires 41 finding some of resources and conversion mechanisms in order to fulfill the energy demands / 42 requirements of all the tasks in an optimum attitude [5]. The feasibility outcomes of wind energy 43 44 station design works depend on the characteristic of the present meteorological report as well as on the suppositions about available space and technology [6]. These results can just ensure an 45 approach of the all wind power potential and it can change considerably for diverse regions [7]. 46 Using meteorological data, the wind energy output can be calculated for a wind turbine brand [8]. 47 The distribution of the wind turbine brands worldwide is given in Fig. 3 [9]. The diverse brands 48 49 of wind turbine generate diverse quantities of energy linked to the wind speed for a specific region [10]. 50

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Fig. 1. The potential for wind electricity generation around the world [3]

500000 450000 400000 350000 250000 150000 150000 50000 0 0 0 0 0 0 0	1.1	1. 1					-	-									
0	China	United States	German y	India	Spain	UK	Canada	France	Italy	Brazil	Sweden	Poland	Portugal	Denmar k	Turkey	Rest of the World	Total
	1	2	3	4	5	6	7	8	9	10	11	12	13	14		15	
Total capacity 2015	148000	74347	45192	24759	22987	13614	11205	10293	8958	8715	6025	5100	5079	5064	4718	40800	434856
Added capacity	32970	8598	4919	2294	0	1174	1511	997	295	2754	615	1266	126	217	955	5000	63690
Growth rate	29	13.1	11.7	10.2	0	9.4	15.6	10.7	3.4	46.2	11.1	33	2.5	3.7	25.4	14	17.2
						10110	0.004	0005	0.4.40	50.50	5405		10.50	1000	0.0.0		0.000

54 55

Fig. 2. Top 15 countries by total wind installations [4]





Fig. 3. Distribution of the wind turbine brands worldwide [9]

For this reason, the best wind turbine selection has a significant task evidenced by a few good 58 investigations found in the literature. With an optimization model, Borissova and Mustakerov 59 evaluated twenty-four different wind turbine brands [11]. Al-Hadhrami assessed the generating 60 wind energy of sixteen different wind turbines in the group of 50-80 kW, 15-20 kW, 5-10 kW 61 and 1–3 kW rated wind energies, and the influence of the hub height on generating wind energy; 62 the best proportion changing in yearly energy generation efficiency acquired for a rise in the hub 63 height of 30 m from 10 to 20 m [12]. Alimi et al. evaluated eight different wind turbines at 64 diverse hub-heights for the wind energy production in Tunis [Nordex (2300 kW) N90-100, 65 Vestas V80, Anbonus MK III-30, V82-0.9, V39-35, GE 1500 kW, Dewind 1250 kW, and 66 Repower (2000 kW) MM 70-65] [13]. Filho and De Araujo Lima evaluated by using three 67 diverse brands of wind turbine (Bonus Mk III, Bonus Mk III and Vestas V27) in Paraiba [14]. 68 Jowder applied a classic method to comparison five wind turbine brands [Gamesa (G58, G80) 69 and Nordex (N60, N70, N80)] at 60 m height, identifying that the best turbine was G58 [15]. For 70 the Niger region, Adaramola et al. appraised the performance of four different wind turbine 71 brands ranging from 500 to 35 kW [ZEUS 500, G-3120, WES-30 and P19-100], acquiring that 72 73 the wind energy output from G-3120 was the best [16]. Adaramola assessed the wind energy generation in Ghana by using four diverse wind turbines [Garbi150/28, Polaris 15-50, CF-100, 74 and WES30] [17]. With an evaluative algorithm, González et al. evaluated the four wind turbines 75 for the optimization of wind energy station turbines [18]. Montoya et al. used a multi-objective 76 77 optimization algorithm for the best wind turbine selection by using the energy outputs of twentysix diverse brands of wind turbines [19]. Kolios et al. ensured a systematical methodology by the 78 TOPSIS for evaluation and classification of diverse present wind turbine backing structures [20]. 79 Martin et al. used the TOPSIS method for evaluation of conception design process of wind 80 turbine support devices [21]. Lee et al. applied a multi criteria decision making method, with the 81 unification of AHP and the risks, costs, opportunities, and benefits, concept to help choose an 82 appropriate wind energy station project [22]. For selecting the best of wind turbine, Nahi and 83 Nabavi defined the network using Monte Carlo method and wind speed data in the region Manjil. 84 For necessary simulations, they used Random Numbers Simulation method by using the software 85 86 EXCEL and MATLAB [23]. Pohekar and Ramachandran used the multi-criteria decision making method for renewable energy planning [24]. Fthenakis and Haaren applied different economic 87

and ecological criteria such as the precaution of economic costs to the wind energy generation
[25]. Demirtas applied AHP in evaluating renewable energy technologies from environmental,
technical, economical, and social perspectives [26]. Shokrzadeh analyzed the performance of
parametric and non-parametric methods over four selected wind turbines using simulated data
sets [27]. Somma et al. studied operation optimization of distributed energy systems. The results
indicate that exergy efficiency can be improved while cost of energy reduced [28, 29].

The objective of this paper is to introduce a decision-making model consisting a wide-range of 94 criteria. Although there are studies in the above-mentioned literature providing various decision-95 making techniques, their approach consists a limited perspective. In this paper, multi-criteria 96 decision making method is utilized in evaluating the anticipated performance of several popular 97 brands of wind turbines for 2 MW, and experts in wind energy stations are invited to offer their 98 expertise in detecting the relative significance of the factors of different wind turbine brands. The 99 wind turbine brands are evaluated based on 13 different criteria, grouped under technical, 100 economic, environmental and customer categories. Considering each and every factor, the best 101 wind turbine for installation is determined after the required calculations. 102

103 The obtained results can serve as reference for the new wind energy station designs in choosing 104 the best wind turbine brand. Determining the related criteria, grouping them in main categories 105 and determining their relative weights based on expert opinions are the main contributions of this 106 research. The constructed model can be solved by various multi-criteria decision making 107 techniques. The selection of the best wind turbine here is determined by using AHP technique. 108 The obtained results are commercially feasible and applicable. Accurate and up-to-date data are 109 obtained from leading companies in the industry.

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111 **2.** Multi-criteria decision making in wind turbine selection

112 **2.1. Main criteria**

In an AHP hierarchy for choosing a wind turbine, the goal would be to choose the best turbine. 113 Technical, economic, environmental, and customer related factors are the four main criteria that 114 are used in majority of the related literature [21, 22] for making a decision. These criteria are 115 often subdivided into several sub-criteria. In this study, the technical criterion is subdivided into 116 output, capacity, rotor diameter, hub height, cut-out wind speed, and nominal wind speed. The 117 cost criterion is subdivided into total cost and state support. The environmental criteria include 118 noise and electromagnetic effects. Finally, the customer satisfaction is measured using service, 119 availability of spare parts, and reliability. Six alternative 2 MW wind turbines are compared using 120 AHP technique. The hierarchy composed of these criteria is constructed as shown in the Fig. 4. 121





Fig. 4. The network for 2 MW wind turbine selection

While measurements for some criteria are readily available, some others like customer satisfaction can only be estimated with respect to other variables. As it is the case in all multicriteria decision making methods, the relative weights of such criteria need to be determined. In AHP, this is accomplished by pairwise comparison of the elements, starting with the main criteria. Fig. 5 is displayed the resulting priorities of technical, economic, environmental, and customer related factors.



130 131

Fig. 5. Main criteria priorities

132 2.2. Sub-criteria

At this point, the comparison for technical criterion has been made, and the AHP method has derived the local priorities for this group (Fig. 6). These priorities reflect on how much it contributes to the priority of its parent, thus we need to calculate the global priority of each subcriterion. That will show us the priority of each sub-criterion with respect to the overall goal. The global priorities throughout the hierarchy should add up to one. The global priorities of each technical sub-criterion are calculated by multiplying their local priorities with the priority of technical criterion.



- 145 Fig. 6. a. Technical sub-criteria priorities b. Local and global priorities

146 In the economic subgroup, there is only one pair of sub-criteria, namely total cost of investment 147 and state support available. These elements are compared as to how important they are with 148 respect to the economic criterion. Fig. 7 is showed the economic sub-criteria priorities.





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Environmental factors considered are noise and electromagnetic effects. Comparison of these
elements with respect to the environmental considerations leads to the resulting weights. The
environment sub-criteria priorities are shown Fig. 8.

Finally, there are three sub criteria in the customer satisfaction subgroup, namely service, spare parts, and reliability. These elements are compared as to how they add value towards the customer satisfaction. These are the resulting weights based on the pairwise comparisons. Fig. 9 is displayed the customer sub-criteria priorities.



170 Fig. 8. a. Environment sub-criteria priorities

b. Local and global priorities





173





Reliability 0.167 0.00295 0.167 0.00295 0.167 0.00295 0.167 0.00295 0.167 0.00295 0.167 0.00295 0.167 0.00295 0.01768

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lle.

Local Global Local Global Local Global

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0.167 0.00741 0.167 0.00741 0.167 0.00741 0.167 0.00741 0.167 0.00741 0.167 0.00741 0.167 0.00741 0.04446

0.167 0.00467 0.167 0.00467 0.167 0.00467 0.167 0.00467 0.167 0.00467 0.167 0.00467 0.167 0.00467 0.02805

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Total

Local Global

Fig. 9. a. Customer sub-criteria priorities b. Local and global priorities 176

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Global

0.1 0.08 0.06 0.04 0.02

0

■ Service

■ Spare

Local

2.3. Pairwise Comparison of the Alternatives with Respect to the Criteria 177

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Local Global

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As seen in Fig.10 below, the resulting weights are based on the principal eigenvector of the 178 decision matrix. After determining the priorities of each criterion with respect to the overall goal 179 of selecting the best wind turbine and priorities of sub-criteria with respect to their associated 180 main criteria, the turbine alternatives need to be compared two by two with respect to each sub-181 criterion. 182



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191 The technical properties of the selected 2 MW wind turbines are presented in Table 1. Cut-In 192 Wind Speed, Turbine Output, and Frequency values for all turbines are kept constant while the 193 remaining values are used to compare the alternatives.

Turbine Name	T1	T2	T3	T4	T5	T6
Cut-In Wind Speed	3.0	3.0	3.0	3.0	3.0	3.0
Turbine Output (V)	690	690	690	690	690	690
Frequency (Hz)	50, 60	50, 60	50 (60E)	50/60	50	50/60
Annual Output (8	9 269 000	9 327 000	8 498 000	9 074 000	8 825 000	8 676 000
m/s) in KWh						
Capacity Factor	32.4	32.9	30.2	32.0	31.1	30.7
Nominal Rotor	114	116	103.0	110	98	92.5
Diameter (m)						
Hub Height (m)	80/93/125	80/94	80/ 90	80/ 95	60/80/98	64/80/100
Cut-Out Wind	25.0	25.0	22.0	20.0	25.0	24.0
Speed (m/s)						
Nominal Wind	12.0	10.0	10.0	11.5-12	15	12.5
speed (8 m/s)						

195

194

196 The economic properties of the alternatives are presented in Table 2.

197

 Table 2. Economic Properties [30]

Turbine Name	T1	T2	T3	T4	T5	T6	
Total Cost	4.00	3.89	3.45	3.82	4.25	3.67	
(million\$)							
Support of	0.330	0.316	0.315	0.440	0.450	0.300	
Government							

198

Table 3 shows the environmental effects of the turbines. Noise level and the electromagnetic effects are chosen as the differentiating elements among different turbine alternatives.

201

 Table 3. Environmental Properties [30]

Turbine Name	T1	T2	T3	T4	T5	T6
Max. sound power (dB)	101,6	105	98.6	107.6	103.5	102.9
Electromagnetic effects*	8-19	9-18	7-16	8-19	8-17	7-13

* Range of variation

In order to measure the customer satisfactions towards the wind turbines, three sub-criteria are defined: customer service, spare parts available, and the reliability of the company. Service is evaluated to be positively related to the number of branches available for each company. Spare parts are measured by the inventory levels of the companies while the reliability is measured by their market shares and sales. The companies are ranked from 1 to 6 to be able to generate a medium of comparison. Table 4 is summarized Customer Service properties.

The next step in applying the AHP technique is two by two comparisons of the turbine alternatives with respect to each sub-criterion. In order to design an objective scheme for this purpose, the maximum and minimum values of the alternatives for each sub-criterion are determined. This range is divided into nine even classes since AHP requires pairwise comparisons on a scale from 1 to 9. Finally, each alternative is placed in one of these classesbased on their values to compare them with each other. Remainder of this section presents the

215 priorities obtained under each subcategory using this scheme.

216

Table 4. Customer Service Properties [30]

Turbine Name	T1	T2	T3	T4	T5	T6
Service support	3	4	6	2	1	5
Spare part	2	4	5	3	1	6
Reliability	4	3	6	2	1	5

217

218 **3. Results and Discussion**

219 **3.1. Making the Decision**

- 220 Based on the calculations above, the relative priorities corresponding to the attractiveness of each
- 221 wind turbine about all factors of technical, economic, environmental and customer satisfaction
- are presented Fig. 11.



223 224



225 4. Conclusions

Wind energy systems have proven their benefits for the last ten years, one way or the other, wind technology has been commercialized for energy generation purposes in more than 30 countries including both the developing and the developed ones. In this study, we demonstrated that it is possible to utilize AHP as the multi-criteria decision making method for the selection of the best wind turbine. Consistency ratios calculated throughout the analysis are in acceptable limits, showing the legitimacy of the results. Below conclusions can be drawn from the analysis in the present paper:

1-The six wind turbine brands as the result of the exhaustive study were investigated through fourmain criteria; technical, economic, environmental impact and customer satisfaction.

2-With the ultimate purpose of optimizing the output and trying to determine the optimum windturbine of commercially present "Wind turbine brands", all the criteria are examined by AHP.

- 3- Within the first stage of the wind turbine brands, alternatives and utilities were put to the essay
 of "priority" and evaluated, important results were obtained, the technically optimum wind
- 240 turbine was observed to be T1.
- 4- T3 is the most significant turbine considering the economical properties of wind turbinebrands.
- 5- From the perspective of environmental effects, the best wind turbine was observed to be the T3as well.
- 6- The fourth stage was searching to find out customer satisfaction effects of wind turbine brands.
- 246 Once again, T3 brand withstood the expert opinions and completely exhaustive of criteria arose
- from the application among the all wind turbine brands.
- For 2MW, the best wind turbine brands are listed based on interviews with experts and literature review and they are used to establish a decision-making model with four main criteria. Although
- 250 2MW turbines are used to apply in this study, a robust model is developed so it can be applied for
- all cases. Determining the related criteria and grouping them in main categories is another
- contribution provided by this research. The selection of the best wind turbine here is determined
- 253 by using AHP technique. The results are significant both from engineering and economic
- 254 perspective as the applied methodology is practically implementable and commercially viable.
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Research Highlights

- 1. Proposing a novel approach to select of the best wind turbine.
- 2. Developing this approach for determining the criteria as well.
- 3. Including analysis of the proposed multi-criteria decision making method
- 4. Developing this concept from the feasible and applicable points of view.
- 5. The selection of the best wind turbine brand except that conventional methods.