

# Wind Farm Optimization



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# **ABSTRACT**

The main advantages of wind turbines, beside the contribution to the environment, include an unlimited, free, renewable resource, economic value, maintenance cost, and placement of wind harvesting facilities. The project aims to investigate the performance criteria of wind turbines and the effect of wind speed on power generated turbines. Wind turbine efficiency and the cost of manufacturing a turbine are subject to the wind regime planning. The driving force behind the project is to understand if the wind turbine is operating at optimal conditions based on the telemetry data. Our undertaking is to empower EnerjiSA to enhance their wind control ventures, so that the company could construct more proficient wind turbines.

With the code generated, all turbines' monthly and yearly power outputs and graphs are plotted seperately through MATLAB. Data must be filtered to remove the curtailment (various losses from the regular operation of the turbines. In order to select the control and target turbines, the average power output of all turbines is generated and the most stable, infrequently errored turbines are selected as

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# **OBJECTIVES**

- Examining the fault records of the system and the loss of energy because of non-optimised planning.
- Translating the distinctions on power curves of the turbines, analyzing the power changes in absence of productivity under various circumstances.
- Enable EnergiSA to improve the working efficiency of the wind turbines, procrastinate the maintenance times of the turbines and minimize the costs related to the maintenance processes.

# **METHODOLOGY**

To examine these problems and come up with a conclusion, the following steps must be considered:

#### the control turbines.

```
clear all
clear all
                                                                                             load('io cleanfiles.mat')
yillar = [2016,2017];
                                                                                             load('test cleanfiles.mat')
for j = 1:1 %1:1 2016 only, 1:2 2016 and 2017, ...
                                                                                             %% use the following loops to combine different cleanpowers and cleandates
 for m=1:12
 strmonth = strcat('m',num2str(m+(j-1)*12));
                                                                                             % for j = 1:1 %1:1 2016 only, 1:2 2016 and 2017, ...
  for k = [27:29 43:45]
                                                                                             % for m=1:1
    clear tmp1 txt1 raw1
                                                                                             % strmonth = strcat('m', num2str(m+(j-1)*12));
    fname = string(strcat('power2016-27-28-29-43-44-45/',num2str(m),'.xls'));
                                                                                             % for k = [29]
    [tmp1,txt1,raw1] = xlsread(fname,strcat('Sheet',num2str(k)));
                                                                                                   strtur = string(strcat('t',num2str(k)));
    strtur = string(strcat('t',num2str(k)));
                                                                                                   cleandates.(strtur).(strmonth) = cleandates2.(strtur).(strmonth);
     powers.(strtur).(strmonth) = tmp1(:,1);
                                                                                                    cleanturbines.(strtur).(strmonth) = cleandturbines2.(strtur).(strmonth).
     dates.(strtur).(strmonth) = txt1(:,2);
    faults.(strtur).(strmonth) = tmp1(:,2);
    nofaults = find(tmp1(:,2)~=1);
    cleanpowers.(strtur).(strmonth) = tmp1(nofaults,1);
    cleandates.(strtur).(strmonth) = txt1(nofaults,2);
    for k = [46:48]
    clear tmp1 txt1 raw1
                                                                                             clear bins
    fname = string(strcat('power2016-46-47-48/',num2str(m),'.xlsx'));
                                                                                             powers = [100:100:2800]
    [tmp1,txt1,raw1] = xlsread(fname,strcat('Sheet',num2str(k)));
                                                                                             for m = 1:1
    strtur = string(strcat('t',num2str(k)));
                                                                                             strmonth = strcat('m',num2str(m));
     powers.(strtur).(strmonth) = tmp1(:,1);
                                                                                             for k = [30:32];
    dates.(strtur).(strmonth) = txt1(:,2);
                                                                                                strtur = string(strcat('t',num2str(k)));
    faults.(strtur).(strmonth) = tmp1(:,2);
                                                                                                for j = 1:length(powers)
    nofaults = find(tmp1(:,2)~=1);
                                                                                                   bins.(strtur).(strmonth)(j) = ...
    cleanpowers.(strtur).(strmonth) = tmp1(nofaults,1);
                                                                                                       sum(abs(cleanpowers.(strtur).(strmonth)-powers(j)) < 50);</pre>
    cleandates.(strtur).(strmonth) = txt1(nofaults,2);
                                                                                             end
end
                                                                                             end
```



#### Codes genereated for the data analysis

- The selection of the turbine that intended to be examined; from the BARES Fault List, according to the fault duration, date and maintenance duration.
- The examination of the power curves and noises of the turbine before and after the fault and maintenance.
- Selection of different periods for the turbine to compare and contrast the properties, characteristics, changes and similarities.
- Comparing cumulative distributions of power data with cross validation. (By determining a specific control turbine, compare 2016 and 2017 to see how much they correlate)
- The generation of the MATLAB code to check and plot the graphs of the clean turbine data.
- The turbines with the smallest difference from the average power output of all the turbines are chosen as "Control Turbines" as representatives of the wind farm and the others are chosen as "Target Turbines".

## **PROJECT DETAILS**

The daily power generation data of 52 turbines for 10-min intervals during years 2016 & 2017 and the fault list of the turbines were provided by the company. In order to reach the clean data of the turbines, the dates that contain faults are excluded from the excel sheet by defining binary numbers to compare the past and current power outputs by cross check validation.



# DISCUSSION

- How the power output changed after the operations?
- What kind of similarities/differences does a turbine show before/after the operation?
- How the turbine reacts under some parameters like same/different wind speed and/or temperature?

2 3 4 5 6 7							I	BALIKESİR WPP ARIZA TAK	(iP LiSTESİ (	GE-F-3235_3)					
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5745	5637	8.10.2017	T36	03:36	03:39	Fault	71	Dirty gearing oil filter (switching off)	fault	Gearbox	Remote reset	00:03	0,050	448,92 kWh	
5780	5672	9.10.2017	т36	13:57	16:29	Harici mücbir	147	Load shutdown	information	No Fault	Türbin RMU flair sistem kurulumu yapılıyor.Toroidal akım trafosu montajı yapıldı.Kablosu cekildi.	02:32	2,533	1074,35 kWh	
5785	5677	9.10.2017	т36	16:29	18:24	Fault	179	Emergency braking system test required	safety crit. fault	Pitch	Axis 1-3 nolu batarya ve charger 10 A sig. değişti.	01:55	1,917	938,99 kWh	
5881	5773	13.10.2017	т36	03:18	03:19	Fault	144	Blade angle asymmetry	fault	Pitch	Remote reset	00:01	0,017	25,44 kWh	
5883	5775	13.10.2017	т36	02:25	02:26	Fault	71	Dirty gearing oil filter (switching off)	fault	Gearbox	Remote reset	00:01	0,017	0,00 kWh	
5975	5867	16.10.2017	т36	11:17	11:34	Fault	71	Dirty gearing oil filter (switching off)	fault	Gearbox	Remote reset	00:17	0,283	234,35 kWh	
6067	5959	19.10.2017	т36	19:25	19:27	Fault	71	Dirty gearing oil filter (switching off)	fault	Gearbox	Remote reset	00:02	0,033	107,67 kWh	
6113	6005	23.10.2017	т36	03:18	03:21	Fault	71	Dirty gearing oil filter (switching off)	fault	Gearbox	Remote reset	00:03	0,050	0,00 kWh	
6191	6083	26.10.2017	т36	09:56	11:10	Unplanned Work	155	Maintenance	information	User	Cable connection fault detection system installation.Flair sistem montaji	01:14	1,233	88,51 kWh	
6194	6086	26.10.2017	T36	11:39	11:42	Fault	71	Dirty gearing oil filter (switching off)	fault	Gearbox	Remote reset	00:03	0,050	4,27 kWh	
6198	6090	26.10.2017	T36	12:25	14:08	Unplanned Work	156	Repair	information	User	End of warranty inspection (Garanti sonu denetimi) yapıldı.	01:43	1,717	833,21 kWh	
6264	6155	29.10.2017	т36	22:14	22:15	Fault	71	Dirty gearing oil filter (switching off)	fault	Gearbox	Remote reset	00:01	0,017	350,93 kWh	
6331	6222	1.11.2017	T36	20:42	20:55	Fault	177	Tower vibration	fault	Sensor Fault	Remote reset	00:13	0,217	167,70 kWh	
6332	6223	1.11.2017	T36	21:47	21:51	Fault	177	Tower vibration	fault	Sensor Fault	Remote reset	00:04	0,067	66,84 kWh	-
6334	6225	1.11.2017	T36	23:31	23:50	Fault	177	Tower vibration	fault	Sensor Fault	Remote reset	00:19	0,317	139,85 kWh	

BARES Fault List

t Time:       01.01.2017 00:00:00       End Time:       01.02.2017 00:00:00         etem       Timestamp       Power(kW)         01.01.2017 00:00:00       -25,666666603         01.01.2017 00:10:00       -23,07500076         01.01.2017 00:20:00       -22,24126434         01.01.2017 00:30:00       -24,40333366         01.01.2017 00:50:00       112,8583298         01.01.2017 01:00:00       117,4633331         01.01.2017 01:10:00       141,53666699         01.01.2017 01:20:00       150,1064911         01.01.2017 01:30:00       130,7799988         01.01.2017 01:50:00       109,5833359         01.01.2017 01:50:00       109,5833359         01.01.2017 01:50:00       109,5833359	perational Data - Wind Turbines								
Exercted Systems           Timestamp         Power(kW)           01.01.2017 00:00:00         -25,66666603           01.01.2017 00:10:00         -23,07500076           01.01.2017 00:20:00         -22,24126434           01.01.2017 00:30:00         -24,40333366           01.01.2017 00:50:00         112,8583298           01.01.2017 01:00:00         117,4633331           01.01.2017 01:10:00         141,5366669           01.01.2017 01:20:00         150,1064911           01.01.2017 01:30:00         130,7799988           01.01.2017 01:50:00         109,5833359           01.01.2017 01:50:00         109,5833359	t Time:	01.01.2017 00:00:00	End Time: 01.02.2017 00:00:00						
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Turbine01 Jan 2017 data

 Will developing different alternatives (i.e for pitch control) helps with with the optimization of turbines?

### **REFERENCES**

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