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Surge Detection System for Centrifugal Compressor

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Abstract

Problem: The turbo compressor Surge is an unstable operating mode of compression system that occurs at mass flows below the so-called surge line. The instability is characterized by large limit cycle oscillations in compressor flow and pressure rise that reduce compressor performance and endanger safe operation. **Approach:** The attempt to find a simple model structure which can capture in some appropriate sense the key of the dynamical properties of the physical plant, we study the application possibilities of the anti-surge detection system to protect the turbo compressor from surge by using Neural fuzzy. **Results:** By simulating new Neural-Fuzzy system which has been made for demonstrate the validity of proposed control scheme, the results shown that the fuzzy system can be a good anti-surge detection system compared by used system. **Conclusion:** The proposed fuzzy system successfully performed the surge detection like the active detection system of a centrifugal compressor.

Keywords: Centrifugal compressor, anti-surge detection, safety systems, neural, fuzzy models, ANFIS.

Introduction

A COMPRESSOR transfers kinetic energy from an aero-mechanically-driven rotor to a steady flow of gas. The pressure of the gas is raised by converting the acceleration imparted by the rotating parts of the compressor via diffusion. In normal operation of a compressor, the flow is nominally steady and axisymmetric. The pressure rise is dependent on the speed of rotation, but the efficient range is limited.

As the flow through the compressor is throttled from the design point to the stall limits, the steady axisymmetric flow pattern becomes unstable. This instability can take on one of two forms, either surge or rotating stall depending upon the compressor speed. The performance of a compressor is plotted as pressure ratio versus mass flow for different rotational speeds. The plot is divided into two regions by the stall (or surge) line. This line defines the operation limits of the compressor. To the left of the stall line the flow is no longer steady. [1]

The concept of stabilizing a compression system to the left of the surge line by modifying its dynamics through the use of appropriate feedback has led to many promising results. Therefore, the goals of the research are to determine the critical barriers for the industrial application of active surge detection system and to investigate how these can be removed [2]. Surge in centrifugal compressors cannot, in general, be avoided when a unit trip or a major upset occurs, but the energy of surge should be minimized. Surge is a dramatic collapse of flow within a centrifugal compressor which results in reverse flows within the machine and attached

piping and can cause damage to bearings and other components.

During normal and slowly changing operations, surge can be avoided by recycling gas through the surge control valve to maintain a minimum flow. However, when a trip or major upset occurs, flow rate drops and the primary means by which surge energy can be reduced to lower the head (suction to discharge pressure difference) at which the compressor reaches the surge (minimum stable) flow condition. The head across a compressor during a trip or upset is dependent on the response of the entire system including changing performance of the compressor, transient flows within the piping, control system responses, and capacity and opening rate of surge and other automatic valves, such as vent or blow down valves, and check valves [3].

This paper describes tools and techniques that can and have been used to model performance and control responses and time dependent head in compressor systems. The tool used in this study is Adaptive neuro fuzzy inference system (ANFIS) by using some data and operation conditions from compressor site it can train a new fuzzy logic which is used as Anti-Surge detection (ASD). Fuzzy logic models also track the performance of centrifugal compressors at different speeds, account for the rotation inertia of compressor trains, and evaluate the thermo physical properties of gas streams.

Anti-Surge Detection

A. Anti-Surge Basics

The transfer of gas along a pipeline is a common process in the oil, chemical and petro-chemical industries. For cost effectiveness, gas is usually transported at high pressure via a compressor before entering the pipeline. The compressor efficiency is maximized when the flow rate through it is kept low and the pressure high, with the minimum possible flow rate being restricted by the risk of compressor entering surge condition [1].

The surge phenomena is an unstable and undesirable operating condition of the compressor, occurring when the flow through it is reduced to the point where the compressor discharge pressure is less than the line pressure. This causes a momentary flow reversal, reducing line pressure and causing erratic flow output. With the reduced line pressure, flow through the compressor is re-established, causing line pressure to increase and the cycle to begin again. If the factors leading to the surge condition are not correctly and quickly rectified, the output will continue to oscillate resulting in damage to the compressor. The Anti-surge system offers:

- Protection against compressor damage such as bent shafts, cracked or ruptured castings, damaged impeller and bearings
- Reduction in compressor downtime and productivity costs.
- Savings on maintenance costs.

The compressor must not run under these conditions (surge condition). Possible damage caused by surging includes:

1. Rapid flow and pressure oscillations cause process instabilities.
2. Noise.
3. Vibration of machine.
4. Reduces lifetime of the machine or in extreme case surge can cause an accident for a compressor.
5. Rising temperatures inside the compressor.
6. Tripping of the compressor.
7. Mechanical damage.
 - Bearing failure.
 - Stationary and rotating part contact if thrust bearing is overloaded.
 - Increased seal clearances and leakage
 - Rubbing of impellers
 - Destruction of blading
 - Damage to intake filter, process fittings, etc.

A description of the surge control line for the compressor, is typically provided in the form of a performance map. The surge limit model should be based on experimental testing, either in the factory test or from site verification. The surge detected from compressor performance map as Figure 1 which contain the 2 or 3 lines, these lines identify the line of [4]:

1. Surge control line
2. Safety line
3. Surge line

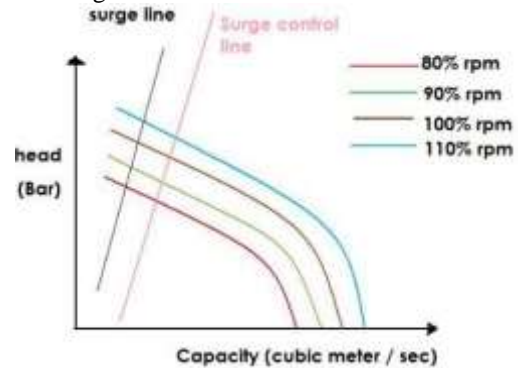


Figure 1: compressor performance map

To determine the status of the operating compressor if it's in surge region or safe region, the operation point on the performance map must be in right side of the surge line. The control line is normally located 10 % to the right of the surge line [5]. The value of operation point of the compressor id depends on Volume flow (\dot{V}) and Enthalpy difference (Δh) which are the axes of the compressor map. The calculation of Volume flow as the following equation:

$$\dot{V} = \sqrt{\frac{\Delta p_1 \cdot T_1}{p_1}} \cdot K \quad (1)$$

Where Δp is the effective pressure (differential pressure over the compressor mouth on the suction side), T_1 is the intake temperature and p_1 the intake pressure. K is a calibration factor derived from the geometry of the compressor.

The enthalpy difference Δh is calculated as:

$$\Delta h = \frac{k \cdot R \cdot T_1}{k-1} * \left\{ \frac{p_1}{p_2} \right\}^{\frac{k-1}{k}} - 1 \quad (2)$$

Where R is the gas constant and k the isentropic exponent. The gas constant and isentropic exponent are dependent on the gas composition. With unchanged gas composition these parameters are constant.

Control-deviation (X_d): The set point value itself is calculated via a graph $V_{eff} = f(\Delta h)$. This graph (anti-surge control line) is fixed during commissioning of the

compressor set. The control-deviation x_d is formed from the difference of the set point value V_{eff}^* minus the actual value as the following equation and graph [6].

$x_d = V_{eff}^* - V_{eff} = \text{negative}$; Then compressor is operating in the stable performance map range.

$x_d = V_{eff}^* - V_{eff} \geq \text{Zero}$; Then compressor is operating at the recycle line.

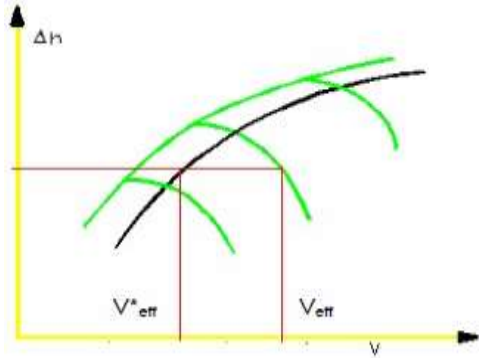


Figure 2: surge line

B. Anti-Surge detection structure

All Anti-surge detection collect operation conditions from the site to use this data to calculate the surge status to protect the compressor from surge, this data is collected and processed by anti-surge detection system to get an output to anti-surge controller to control the recycle valve

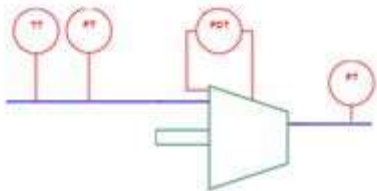


Figure 3: anti-surge detection structure

According to the Figure 3 and to equation (1) & (2) the x_d calculation depends on the following data:

- Discharge pressure
- Intake temp.
- Intake pressure
- DP compressor

This paper will use an existing system to collect the data to the fuzzy system, the collected data is divided into 2 groups, 1st one is the training data which contains 123 points (approximately 50% of them in right side of surge control line and 50% of them in left side of surge control line) and the 2nd group is testing data which contains 10 points (5 points in right side of surge control line and 5 points in left side of surge control line).

Anti-Surge Detection

The Fuzzy Logic tool was introduced in 1965, by Lotfi Zadeh, and it's a mathematical tool for dealing with uncertainty. It offers to a soft computing partnership the important concept of computing with words. It provides a technique to deal with imprecision and information granularity. The fuzzy theory provides a mechanism for representing linguistic constructs such as "low" "medium" "high" In general, the fuzzy logic provides an inference structure that enables appropriate human reasoning capabilities [7].

A. Fuzzy logic – basic principles

Fuzzy logic is the logic that refers to the study of methods and principles of human experience. Fuzzy sets form the building blocks for fuzzy IF–THEN rules which have the general form "IF X is A THEN Y is B," where A and B are fuzzy sets. The term "fuzzy systems" refers mostly to systems that are governed by fuzzy IF–THEN rules [7].

A membership function (MF) is a curve that defines how each point in the input space is mapped to a membership value (or degree of membership) between min and max. The type of membership and the number of memberships will affect the results so it will be better to increase the number of memberships to be 5 memberships for each input as the following:

- LowLow
- Low
- Medium
- High
- HighHigh

These numbers of membership will make 625 rules for the system and they are generated by using the neural fuzzy networks also the type of the membership is important so by using trial and error method ,the better result get with gbellmf membership type.

B. Fuzzy Modeling

A finite fuzzy logic implication statement can always be described by a set of general fuzzy IF–THEN rules containing only the fuzzy logic AND operation, in the following multi-input single-output form [8]:

- (1) "IF (x1 is X11) AND ... AND (xn is X1n) THEN (y is Y1)."
- (2) "IF (x1 is X21) AND ... AND (xn is X2n) THEN (y is Y2)."
-
- (N) "IF (x1 is XN1) AND ... AND (x n is XNn) THEN (y is YN)."

Using Takagi and Sugeno fuzzy rule-based model that can approximate a large number of nonlinear systems, in this research the rules (625 rule) will be as the following example:

IF (Discharge Pressure is LowLow) AND (Intake Temp is LowLow) AND (IntakePressure is Low Low) AND (DP Compressor is LowLow) THEN (Control Deviation-Xd is out1mf1). (3)

IF (Discharge Pressure is Low Low) AND (Intake Temp is Low Low) AND (IntakePressure is Low Low) AND (DP Compressor is Low) THEN (Control Deviation-Xd is out1mf2). (4)

IF (DischargePressure is LowLow) AND (IntakeTemp is LowLow) AND (IntakePressure is LowLow) AND (DPCompressor is Medium) THEN (ControlDeviation-Xd is out1mf3). (5)

& so on...

C. Adaptive neuro fuzzy inference system

The basic structure of the type of fuzzy inference system seen thus far is a model that maps input characteristics to input membership functions, input membership functions to rules, rules to a set of output characteristics, output characteristics to output membership functions, and the output membership function to a single-valued output or a decision associated with the output.[9]

The ANFIS is used to implement the proposed model .It uses the collected training data to train the fuzzy detection system which have 4 inputs with one output. Using a given input/output data set,[10] the toolbox function ANFIS constructs a fuzzy inference system (FIS) whose membership function parameters are tuned (adjusted) using either a back propagation algorithm alone or in combination with a least squares type of method [11].

There are two methods that anfis learning employs for updating membership function parameters:

- Back propagation for all parameters (a steepest descent method)
- A hybrid method consisting of back propagation for the parameters associated with the input membership functions, and least squares estimation for the parameters associated with the output membership functions.[12]

The following figure shows the network structure of the ANFIS that map the inputs by the membership functions, their associated parameters go through the output membership functions.

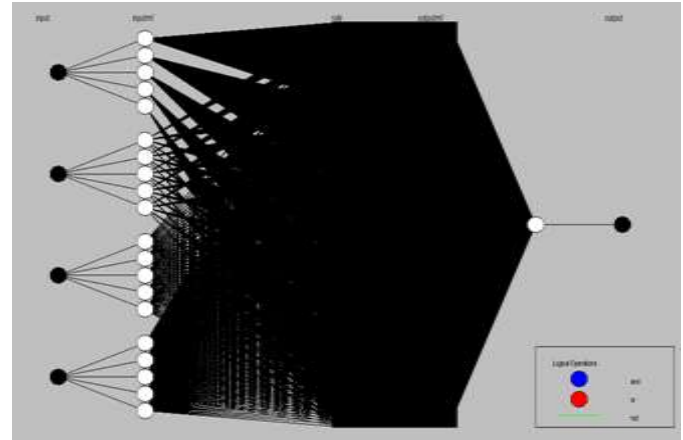


Figure 4: The ANFIS Structure

In the hybrid method of learning it uses a combination of Steepest Descent and Least Squares Estimation (LSE). There are many modes used in combination like: Batch Learning, Pattern By Pattern, & Different ways to combinations. [13]

Training of Fuzzy system is done with the inputs data (Discharge pressure -Intake temp.-Intake-pressure-DP compressor) and one output (Control-deviation) using hybrid method for learning as Figure 5.

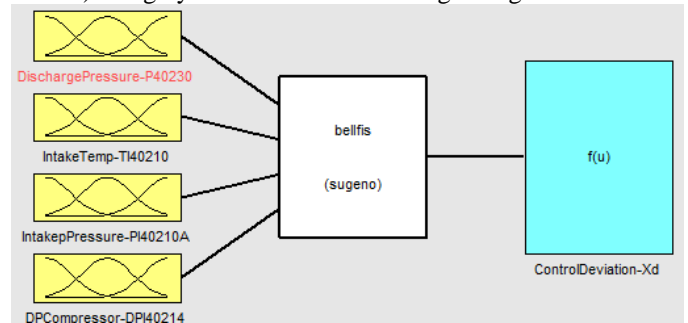
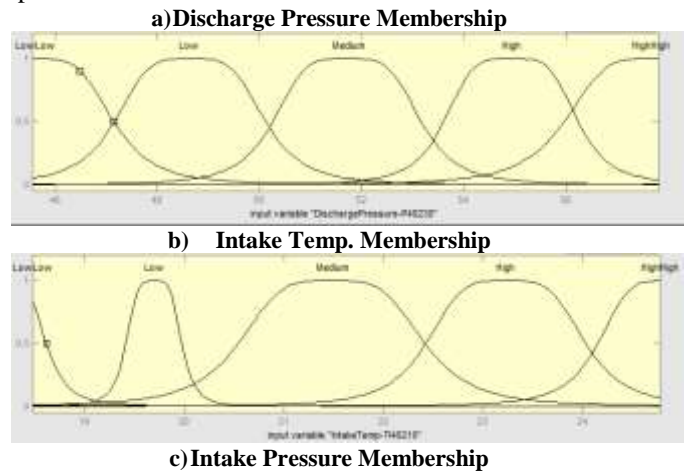
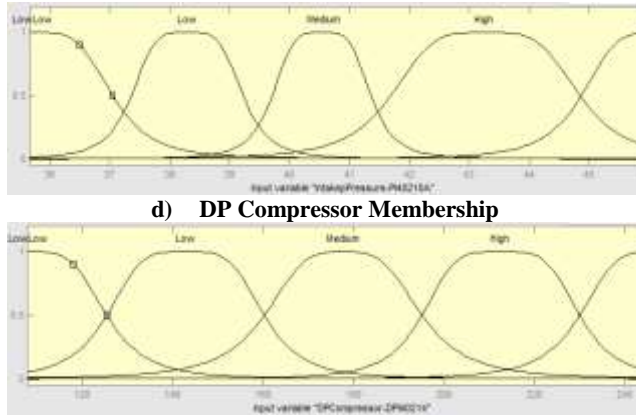


Figure 5: Anfis model structure

The following graphs for membership of inputs graphs:





d) DP Compressor Membership

Figure Error! No text of specified style in document.-2: Membership input data

Results

The results of the two groups of data are presented in this section. After several trials with many types of neuro-fuzzy model the best reasonable error happened with 500 epochs and 5 memberships with gbellmf membership type. As the next graph of error shows that the error is 0.0033741.

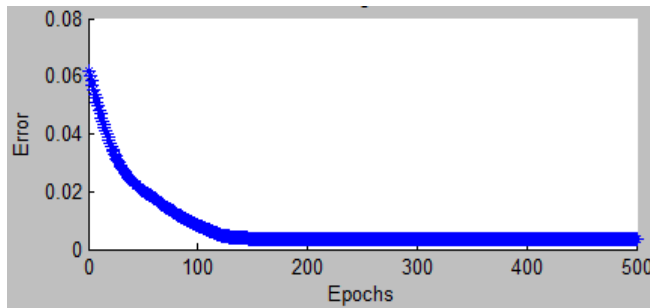


Figure 6: Result with gbellmf membership

After finishing the training of the fuzzy system with this error the next step is to test and simulate the detection system and compare it with the existing system.

The next figure shows the output of the fuzzy system using the training data and the error is 0.17013.

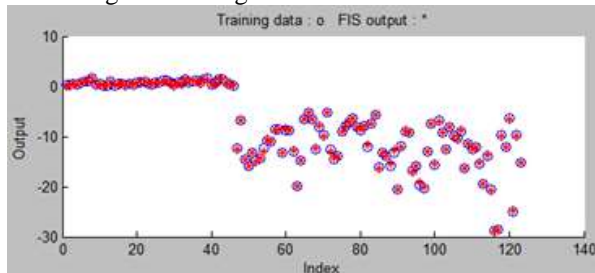


Figure 7: FIS output by using training data

The next figure shows the output of the fuzzy system

using the testing data and the error is 0.37212.

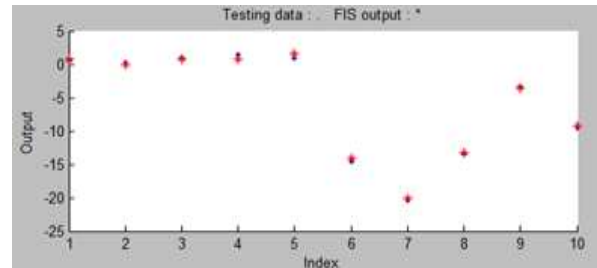


Figure 8: FIS output by using testing data

The next figure shows the data which is used in simulating the fuzzy detection system:

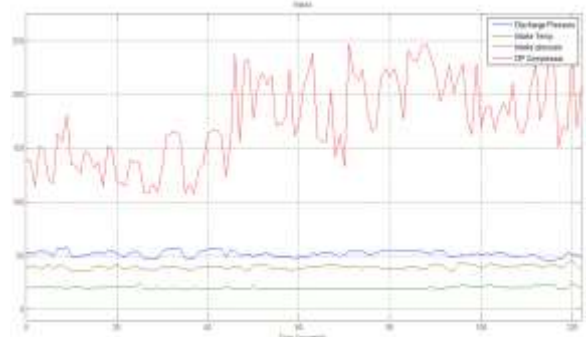


Figure 9: Input data

The next figure shows the output data from simulating fuzzy system (red line) and existing system (black line).

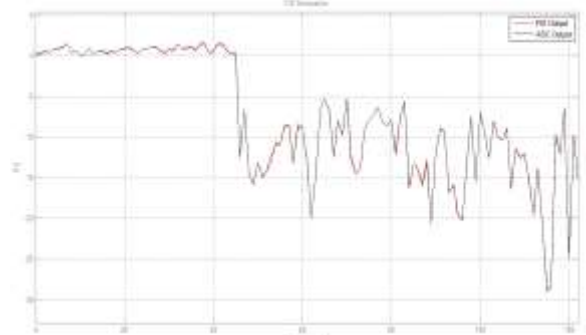


Figure 10: FIS & ASC output

According to all above results. The max error in the FIS is < 0.4 .the control line is normally located 10 % to the right of the surge line [5]. Multiply the surge flow by 1.1 to get the control line flow. According to the result which the error does not exceed $\pm 0.4\%$ and to the compressor manufacturer which confirm the gap between surge line and control line is 10% and the gap between control line and safety line is 10%, therefore $\pm 0.4\%$ is a minor error and accepted, that is because in worst case the FIS will take the action to open the Anti-surge valve

after the control line 0.4 and that mean the valve will be controlled before surge line by 9.6%.

Conclusion

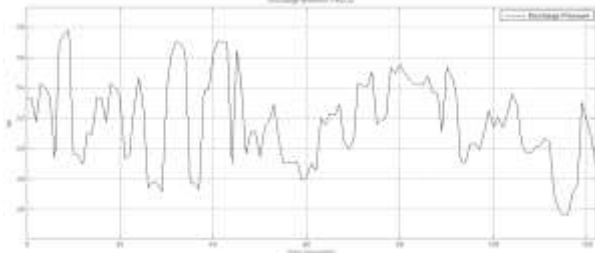
The great benefit of this fuzzy logic approach is that the detection system does not require the knowledge of the compressor map in order to find a desired equilibrium point. As well the same model can operate under active and passive surge control without the knowledge of which method is being implemented. The decision making is based solely on the compression system output, allowing the fuzzy model to be easily adapted to any turbo compressor system.

Future Work

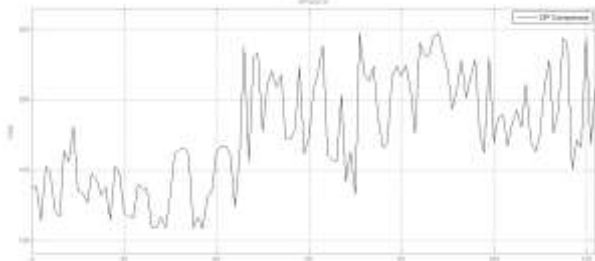
The practical implementation requires more studies as some of the normalization methods used in the ANFIS. My opinion is that more editing in membership parameters will make better results and less error.

APPENDIX

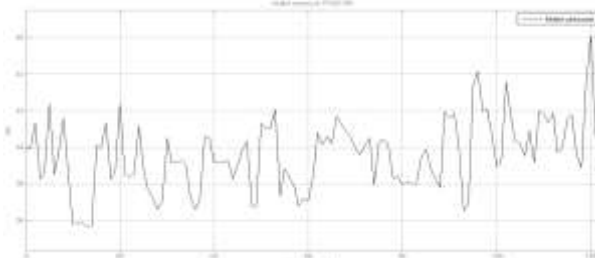
A-Discharge Pressure



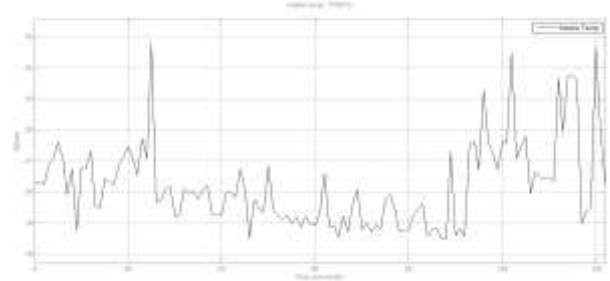
B-Dp Compressor



C-Intake Pressure



D-Intake Temp.



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