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APPLICATION OF FUZZY LOGIC REASONING MODEL FOR DETERMINING ADHESIVE STRENGTH OF THIN FILM COATINGS

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Abstract: In this paper a new approach for determining the Adhesive Strength of thin film coating using fuzzy logic reasoning is proposed. This approach mainly focuses on nano and micro thin films using established International Standards for evaluating adhesion strength. The influence of various coating parameters on adhesion strength is considered. Modeling and Simulation is done in Matlab and the results are also shown in the end.

Keywords: Adhesive, Matlab-Simulink, ANFIS, Fuzzy inference system

1. INTRODUCTION

The emergence of the new field of nanotribology, which pertains to the experimental and theoretical investigations of interfacial processes occurring during adhesion, friction, wear and thin film lubrication of sliding surfaces on the scales ranging from the atomic and molecular scale to the microscale, and its associated techniques have provided a viable means of addressing the tribological issues on the nanoscale [1-3]. In recent industry, nano and micro-thin layers are a popular choice in many of its branches, for its practical adhesion as one of the most important mechanical properties, which is a key parameter for every coating [4,5]. The main purpose of the thin film coating application is to improve the surface properties of the materials while maintaining its bulk properties.

The two main challenging issues that needed to be encountered in the coating process are cost and optimisation [6]. The practical adhesion strength, i.e. the work done to separate the thin film from the substrate, is very sensitive to the measurement and evaluation conditions, such as the strain rate, roughness, thickness, etc[7]. Scratch test was chosen from among a wide choice of adhesion strength measurement methods. The surfaces of samples in scratch tests undergo pulling a (mostly diamond) stylus against them under a normal force [8,9]. The recommended shape of stylus is spherical Rockwell C, 200 μm radius or alternatively a smaller one [10]. Progressive loading scratch test mode (PLST), constant load scratch test mode and multi-pass scratch test mode were modes of measurement used in the scratch tests [11]. Recently non-destructive evaluation (NDE) have become Ubiquitous in manufacturing systems because the technology is an inexpensive and reliable method to measure product requirements [12].

Currently there are already in use internationally recognized industrial standards [13] for evaluating adhesion of macro and micro-layers. The scratch test procedures are described in the national/international standards, which are usually enforced also in the European, American, Japanese or other national standards [14,15]. The standards are designed for a wide range of different coating materials. The most important standards for quantitative single point scratch testing are shown in Table 1.0

Table 1. Standards for quantitative single point scratch testing

| S.NO | STANDARD | PURPOSE |
|------|---------------|---|
| 1 | ISO 1071-3 | Test method for adhesion and other mechanical failure modes of thin advanced technical ceramics. |
| 2 | ISO 20502 | Test method for adhesion of fine ceramics (advanced ceramics, advanced technical ceramics) |
| 3 | ISO N269 | Test method for adhesion of fine ceramics coatings |
| 4 | ISO 1518 | Test method for adhesion of paints and varnishes |
| 5 | ASTM C1624 | Test method for adhesion strength and mechanical failure modes of ceramic coatings |
| 6 | ASTM D7027-05 | Test method for evaluation of scratch resistance of polymeric coatings and plastics. |
| 7 | ASTM D7187 | Test method for measuring mechanistic aspects of scratch/mar behaviour of paint coatings by nano scratching |
| 8 | JIS R 3255 | Test method for adhesion of thin films on glass substrate |

Table 2 presents the most important conditions for the evaluation according to these standards. The standards are designed mainly for macro-scratch testers, as these are commonly used to measure the nano- and micro-layers.

Table 2. Measuring conditions in accordance with appropriate international standards designed for nano and micro-films testing

| | ISO 1071-3 | C 1624-05 | D7187 |
|--|-------------------------------|--|-----------------------------------|
| Film material | ceramic coating and other | ceramic coating | paint coating |
| Film thickness | to 20 μm | from 0.10 μm to 30 μm | to 500 nm |
| Preload | 1 N | 1 N for $L_{\text{max}} < 10 \text{ N}$; 5 N for $L_{\text{max}} > 20 \text{ N}$; | 0.1 to 1 mN |
| Progressive loading scratch test mode – loading rate | 100 N/min | 10 N/min for $L_{\text{max}} < 20 \text{ N}$; 100 N/min for $L_{\text{max}} > 20 \text{ N}$; minimum 5 N/min | 5 to 200 mN/min |
| Progressive loading scratch test mode – displacement speed | 10 \pm 0.1 mm/min | 10 \pm 0.1 mm/min | 0.5 to 10 mm/min |
| Constant load scratch test mode – loading rate | 20% of L_{max} | 20%, 40%, 60%, 100% of L_{max} | – |
| Constant load scratch test mode – displacement speed | 10 mm/min | 10 \pm 0.1 mm/min | – |
| Multi-pass scratch test mode – loading rate | 50% of L_{max} | – | – |
| Multi-pass scratch test mode – displacement speed | – | – | – |
| Stylus geometry | Rockwell C | Rockwell C | spherical, 1 to 100 μm |
| Surface roughness | $R_a < 0.5 \mu\text{m}$ | $R_q < 1 \mu\text{m}$ | – |
| Film hardness | – | $HV > 5 \text{ GPa}$ | – |
| Min. number of test operations | 5 \times | 5 \times | 3 \times |
| Optical microscope | 100 to 500 \times | 100 to 500 \times | – |
| Temperature | 22 \pm 2 $^{\circ}\text{C}$ | 20 \pm 5 $^{\circ}\text{C}$ | 23 \pm 2 $^{\circ}\text{C}$ |
| Relative humidity | 50 \pm 10% | 50 \pm 10% | 50 \pm 5% |

2. FUZZY REASONING APPROACH FOR THE EVALUATION OF ADHESION STRENGTH OF THE NANO AND MICRO FILMS

Fuzzy logic reasoning approach can be used as an effective tool for determining the Adhesion Strength of the nano and micro films. The existing International standards and knowledge of adhesion can be used as models/patterns for setting the fuzzy expert system, which could be used to identify the quality of practical adhesion strength. Also, artificial intelligence methods implemented in Matlab toolboxes [16] can be used in the process. The use of fuzzy logic, as a kind of “soft” computing techniques, enables us to overcome the problems encountered using “hard” computing techniques [17]. The basis for fuzzy logic is the basis for human communication [18]. The purpose of fuzzy control is to influence the behaviour of a system by changing an input or output to that system according to a rule or set of rules that model how the system operates [19]

2.1. Designing of fuzzy reasoning model

The fuzzy expert system uses a fuzzy if-then rule base consisting of a set of intuitive fuzzy rules, interpreting an input and producing a crisp output. In this study output (quality of adhesion) is significantly influenced by the input variables, which are: critical force, coating thickness, loading rate, displacement rate, substrate roughness, coefficient of friction, tip radius, tip wear and tip damage. Figure 1.0 shows the structure of Fuzzy Inference System (FIS) created in Matlab using Fuzzy Logic Toolbox [20] If we look at the figure 1 then we can see that inputs are combined to build Adhesion analysis. Structure of Fuzzy Inference System (FIS) in Fuzzy logic toolbox is shown in Figure 2.

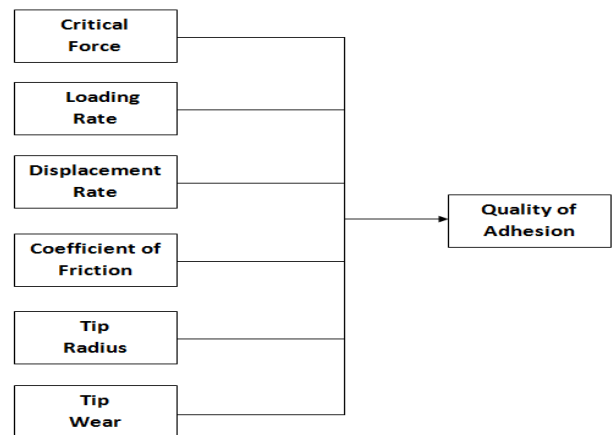


Figure 1. Structure of Fuzzy Inference System (FIS)

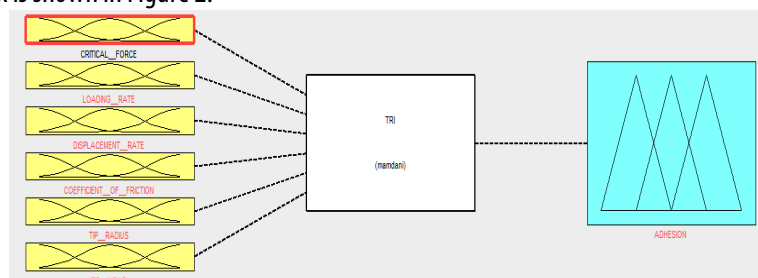


Figure 2. Structure of Fuzzy Inference System (FIS) in Fuzzy logic toolbox

2.2. Defining Universe of Discourse (UOD), Fuzzification of constraints and Membership function's (MF's)

In this research we have fuzzified each of the constraints i.e. Input/Output with four linguistic variables using triangular MF's. The MF's for each of the constraint along with UOD are shown in figure 2 to figure 9.

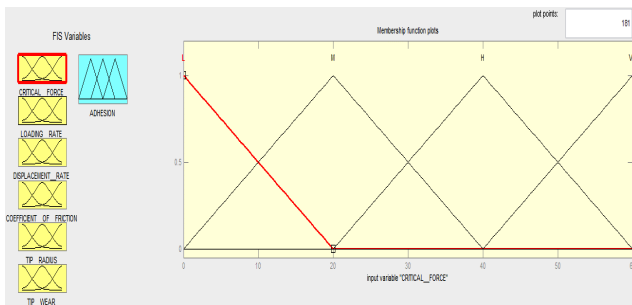


Figure 3. Fuzzified Input parameter 'Critical Force'

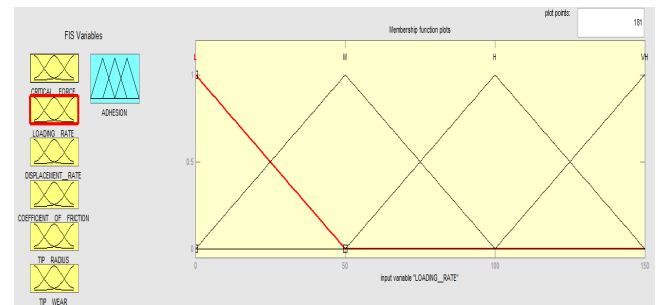


Figure 4. Fuzzified Input parameter 'Loading Rate'

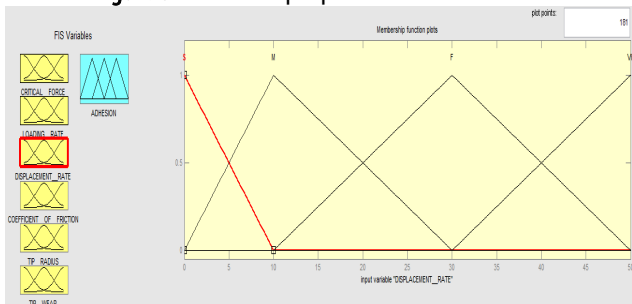


Figure 5. Fuzzified Input parameter 'Displacement Rate'

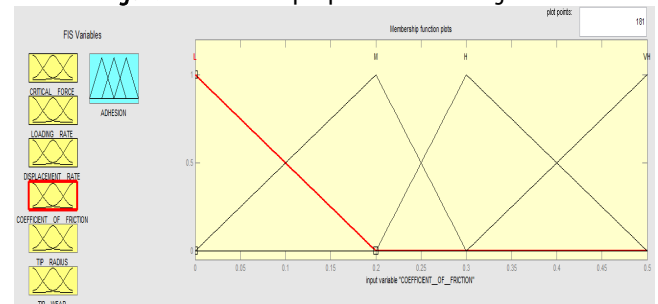


Figure 6. Fuzzified Input parameter 'Coefficient of Friction'



Figure 7. Fuzzified Input parameter 'Tip Radius'

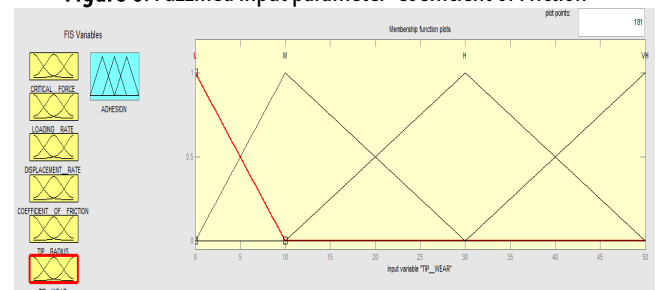


Figure 8. Fuzzified Input parameter 'Tip Wear'

2.3 Defining Fuzzy control rules

In this study we have used fuzzy ordinal approach [21] to develop fuzzy if then rules[22] which has significantly reduced the number of rules. The rules are given different degree of support (DOS) or weights which explains the relative importance of each rule[23]. The fuzzy rules are defined and based on experience of experts. The fuzzy control rules along with DOS for the controller are given below:

- (1) If 'Critical Force' is 'Low' then 'Adhesion' is 'Poor' (1)
- (2) If 'Critical Force' is 'Medium' then 'Adhesion' is 'Moderate' (1)
- (3) If 'Critical Force' is 'High' then 'Adhesion' is 'Good' (1)
- (4) If 'Critical Force' is 'Very High' then 'Adhesion' is 'Excellent' (1)
- (5) if 'Loading Rate' is 'Low' then 'Adhesion' is 'Excellent' (0.2)
- (6) if 'Loading Rate' is 'Medium' then 'Adhesion' is 'Good' (0.2)
- (7) if 'Loading Rate' is 'High' then 'Adhesion' is 'Moderate' (0.2)
- (8) if 'Loading Rate' is 'Very High' then 'Adhesion' is 'Poor' (0.2)
- (9) if 'Displacement Rate' is 'Small' then 'Adhesion' is 'Poor' (0.2)
- (10) if 'Displacement Rate' is 'Medium' then 'Adhesion' is 'Moderate' (0.2)
- (11) if 'Displacement Rate' is 'Fast' then 'Adhesion' is 'Good' (0.2)
- (12) if 'Displacement Rate' is 'Very Fast' then 'Adhesion' is 'Excellent' (0.2)
- (13) if 'Tip Radius' is 'Small' then 'Adhesion' is 'Excellent' (0.3)
- (14) if 'Tip Radius' is 'Medium' then 'Adhesion' is 'Good' (0.3)
- (15) if 'Tip Radius' is 'Large' then 'Adhesion' is 'Moderate' (0.3)

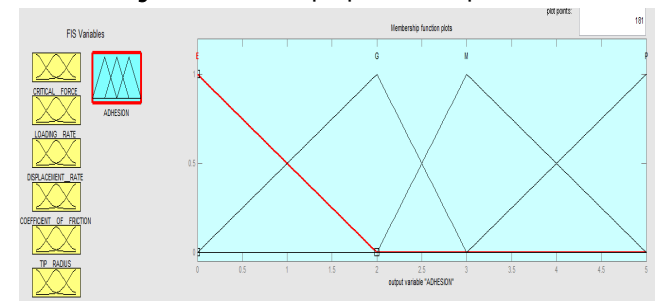


Figure 9. Fuzzified Output parameter 'Adhesion Strength'

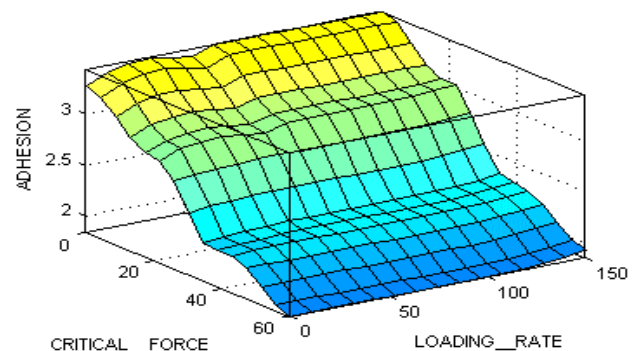


Figure 10. A Surface Viewer for FIS

- (16) if 'Tip Radius' is 'Very Large' then 'Adhesion' is 'Poor'(0.3)
 (17) if 'Tip Wear' is 'Low' then 'Adhesion' is 'Excellent'(0.4)
 (18) if 'Tip Wear' is 'Medium' then 'Adhesion' is 'Good'(0.4)
 (19) if 'Tip Wear' is 'High' then 'Adhesion' is 'Moderate'(0.4)
 (20) if 'Tip Wear' is 'Very High' then 'Adhesion' is 'Poor'(0.4)

As can be seen from above there are total 20 rules. As an example consider rule number 6. In this rule if 'Loading Rate' is 'Medium' then 'Adhesion' is 'Good' with DOS equal to 0.2.

A Surface Viewer for FIS is shown in Figure 10 which demonstrates the relationship between the input variables Critical force, loading rate and output variable Adhesion strength.

As can be seen from the figure 1.9 if we have numerical value of Critical force and Loading rate in the scale of 0-60 and 0-150 respectively, then we can get the value of Adhesive strength in the range of 0-5.

3. SIMULATION RESULTS

Results of simulations for different set of Inputs i.e. critical force (a), Loading rate (b), Displacement rate (c), Coefficient of friction (d), Tip radius (e) and Tip wear (f) are shown below:

Set 1: a=20; b=50; c=10; d=0.2; e=100; f=25 (Figure 11); Set 2: a=50; b=100; c=30; d=0.3; e=200; f=50 (Figure 12);

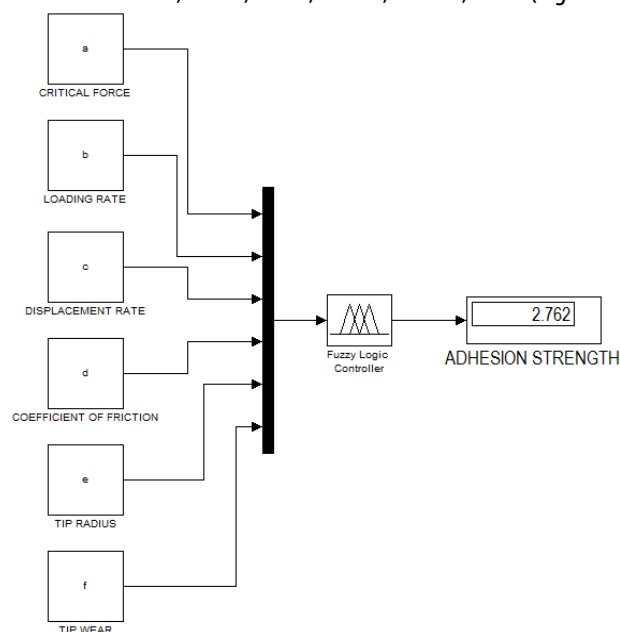


Figure 11. Simulation results

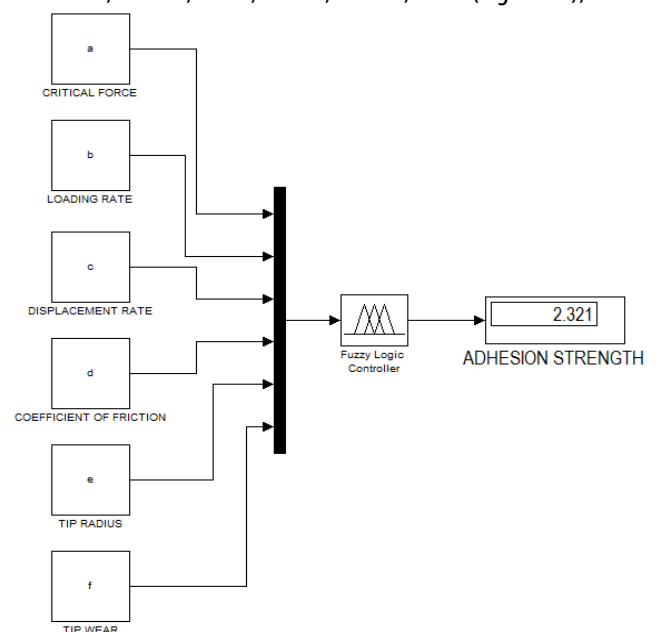


Figure 12. Simulation results

4. CONCLUSION

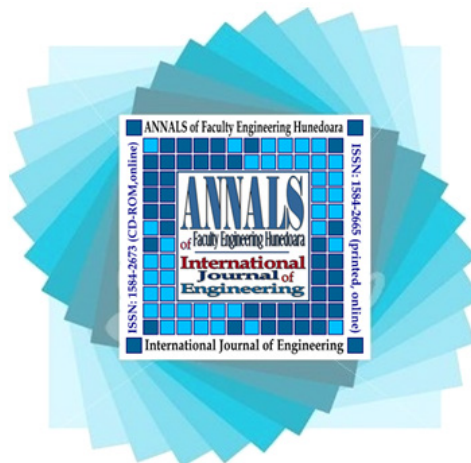
A new approach for evaluation of Adhesive Strength of nano and micro thin films using fuzzy logic reasoning has been proposed. The fuzzy reasoning provides a logical approach to adhesive strength evaluation. The fuzzy ordinal approach proves to be an effective technique thus reducing the number of fuzzy If-then rules. A Matlab Simulink model has been developed and the proposed framework optimises the related constraints.

As an extension for future work Adaptive Neuro fuzzy inference system (ANFIS) approach can also be implemented which can learn through the training data and hence shows better results? We can also consider other constraints which further determine the Adhesive strength.

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