

Rough-Fuzzy Classification on a Decision Table using a Threshold- Algorithms and Implementations

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ABSTRACT

Pawlak's tool of rough sets finds various applications in knowledge engineering. In this paper we developed three algorithms for computing rough computing based indices of similar objects in decision table with fuzzy decision attributes using a threshold on fuzziness and also we implemented these algorithms using C.

Keywords: Rough Sets, Decision table, Rough Indices, Knowledge Engineering

I. INTRODUCTION

Rough Sets [6,7,8] find wider applications in various areas of technologies as well as bio sciences as similar as Fuzzy tools. Considering the importance of these tools various researchers made contributions by hybridizing these concepts. In particular, G.Ganesan et. al., [3,4,5] discussed the procedure of indexing any element of the Universe of discourse through fuzzy a fuzzy subset using rough tools. In this paper, we worked on these contributions and developed the algorithms of three types of indices namely *lower*, *upper* and *rough* and implemented them using C Programming.

This paper is organized into six sections. In Second section, we provided the basic mathematical concepts related to the subsequent sections. In third section, we discussed the lower index algorithm on a decision table with fuzzy decision attribute with a

single threshold and implemented the same using C Programming. In fourth section, upper index algorithm for a decision table with fuzzy decision attribute under one threshold is provided and the same has been implemented using C Programming. In fifth section, rough indexing algorithm using a threshold for a decision table with fuzzy decision attribute is provided and the same has been implemented using C Programming and the paper ends with concluding remarks as 6th section.

II. Mathematical Preliminaries

In this section we provide the basic concepts which are useful for reading other sections.

2.1 Rough Sets

Pawlak's concept of Rough Sets [1,6] is defined as follows: For a given finite universe of discourse U

and an equivalence relation R, denote $U/R = \{X_1, X_2, \dots, X_n\}$ be the collection of equivalence classes induced by R on U. For a given input A, the lower and upper approximations are algorithmically defined as

Lower Rough Approximations

```

\\X1, X2, ..., Xn – Equivalence Classes
\\ A-Input
Let D=NULL
For i=1 to n do
    If Xi is subset of A, then D= D ∪ Xi
Return D
    
```

Lower Rough Approximations

```

\\X1, X2, ..., Xn – Equivalence Classes
\\ A-Input
Let D=NULL
For i=1 to n do
    If A ∩ Xi ≠ NULL then D= D ∪ Xi
Return D
    
```

2.2 Hybridization of Fuzzy Sets and Rough Sets

For a given fuzzy subset A on a finite universe of discourse U, let R be an equivalence relation defined on U and $U/R = \{X_1, X_2, \dots, X_n\}$ denote the partition on U induced by R. For a threshold α ranging between 0 and 1, let $A[\alpha]$ denote the strong α - cut on A. The lower and upper rough approximations of the fuzzy set A [2] are given by $A_\alpha = \underline{A}[\alpha]$ and $A^\alpha = \overline{A}[\alpha]$ respectively.

III. Lower Indices in a Decision Table with Fuzzy Decision Attribute

In this section, we propose an algorithm to compute the lower index using lower rough approximations. In the algorithm, single threshold is used on a fuzzy input A and using square and square root functions, the lower indices are obtained. Also, we illustrate

the algorithm for a decision table with a fuzzy decision attribute.

3.1 Algorithm for Lower index of an element

```

Algorithm (alpha, A, x)
//Algorithm to obtain index of x an element of
universe of discourse
//Algorithm returns the index
1. Let x_index be an integer initialized to M
2. Pick the equivalence class K containing x.
3. If U(y)=0 for all y belongs to K
    Begin
        x_index=-x_index
        goto 7
    End
4. If U(y)=1 for all y belongs to K
    goto 7
5. Compute “A lower bound of alpha”
6. If “ x belongs to A lower bound of alpha”
While (“ x belongs to A lower bound of alpha”)
    Begin
        alpha= sqrt(alpha) //square root of alpha
        x_index=x_index+1
        Compute “A lower bound of alpha”
    End
else
While (“x NOT belongs to A lower bound of alpha”)
    Begin
        alpha= sqr(alpha) //square of alpha
        x_index=x_index-1
        Compute “A lower bound of alpha”
    End
7. Return x_index
    
```

3.2 Experimental Results

Consider the following decision table with 10 records namely 2,3,4,5,6,7,8,9,10 and 11 with three

conditional attributes namely Attr_1, Attr_2, Attr_3 and a fuzzy decision attribute.

	Attr_1	Attr_2	Attr_3	Decision
2	Yellow	Red	Yellow	0.4
3	Red	Yellow	Green	0.5
4	Red	Red	Yellow	0.6
5	White	Green	Blue	0.4
6	Blue	Red	Blue	0.5
7	White	Yellow	Red	0.7
8	Yellow	Green	Blue	0.4
9	Yellow	Blue	White	0.1
10	Green	Green	Red	0.9
11	Blue	White	Blue	0.3

It may be noticed that the records are grouped according the similarity for each key or group of keys. i.e., the records are grouped as follows: For Attr_1, the grouping are {(Yellow,{2,8,9}),(Red, {3,4}),(White, {5,7}),(Blue, 6,11)}, (Green,{10})}. For Attr_2, the grouping are {(Red,{2,4,6}), (Yellow,{3,7}),(Green,{5,8,10}), (Blue,{9}), (White,{11})} and for Attr_3, we obtain {(Yellow, {2,4}), (Green,{3}), (Blue,{5,6,8,11}), (Red,{7,10}), (White,{9})}.

The above example is implemented in C by using Attr_2 as the key and the threshold as 0.35 using the threshold as 0.35 and we obtain the lower index of 2 as 51 and the lower index of 9 as 48

```

*** FUZZY WITH ONE THRESHOLD: LOWER INDEX ***
Universal set = { 2 3 4 5 6 7 8 9 10 11 }
set A = { 0.4 0.5 0.6 0.4 0.5 0.7 0.4 0.1 0.9 0.3 }
U/R set is:
2 4 6
3 7
5 8 10
9
11
Alpha value is 0.35
A[alpha] set = { 2 3 4 5 6 7 8 10 }
A_Lower[alpha] set = { 2 4 6 3 7 5 8 10 }
enter the element X in universal set to obtain lower index to X: 9
    
```

```

*** FUZZY WITH ONE THRESHOLD: LOWER INDEX ***
Universal set = { 2 3 4 5 6 7 8 9 10 11 }
set A = { 0.4 0.5 0.6 0.4 0.5 0.7 0.4 0.1 0.9 0.3 }
U/R set is:
2 4 6
3 7
5 8 10
9
11
Alpha value is 0.35
A[alpha] set = { 2 3 4 5 6 7 8 10 }
A_Lower[alpha] set = { 2 4 6 3 7 5 8 10 }
enter the element X in universal set to obtain lower index to X: 2
Square root is 0.591608
A[alpha] set = { 4 7 10 }
A_Lower[alpha] set = { }
X_index is: 51_
    
```

```

*** FUZZY WITH ONE THRESHOLD: LOWER INDEX ***
U/R set is:
2 4 6
3 7
5 8 10
9
11
Alpha value is 0.35
A[alpha] set = { 2 3 4 5 6 7 8 10 }
A_Lower[alpha] set = { 2 4 6 3 7 5 8 10 }
square is 0.122500
A[alpha] set = { 2 3 4 5 6 7 8 10 11 }
A_Lower[alpha] set = { 2 4 6 3 7 5 8 10 11 }
square is 0.015006
A[alpha] set = { 2 3 4 5 6 7 8 9 10 11 }
A_Lower[alpha] set = { 2 4 6 3 7 5 8 10 9 11 }
X_index is: 48_
    
```

IV. Upper Indices in a Decision Table with Fuzzy Decision Attribute

In this section, we propose an algorithm to compute an index using upper rough approximations. In this algorithm, a fuzzy input A is considered and using a single threshold. For each element, the upper index is obtained using square and square root functions. Also, we illustrate the algorithm for a decision table with a fuzzy decision attribute.

4.1 Algorithm for Upper index of an element Algorithm (alpha, A, x)

```

*** FUZZY WITH ONE THRESHOLD: LOWER INDEX ***
Universal set = { 2 3 4 5 6 7 8 9 10 11 }
set A = { 0.4 0.5 0.6 0.4 0.5 0.7 0.4 0.1 0.9 0.3 }
U/R set is:
2 4 6
3 7
5 8 10
9
11
Alpha value is 0.35
A[alpha] set = { 2 3 4 5 6 7 8 10 }
A_Lower[alpha] set = { 2 4 6 3 7 5 8 10 }
enter the element X in universal set to obtain lower index to X: 2_
    
```

//Algorithm to obtain index of x an element of universe of discourse

//Algorithm returns the index

1. Let x_index be an integer initialized to M
2. Pick the equivalence class K containing x.
3. If $U(y)=0$ for all y belongs to K
 - Begin
 - $x_index = -x_index$
 - goto 7
 - End
4. If $U(y)=1$ for all y belongs to K
 - goto 7
5. Compute “A upper bound of alpha”
6. If “x belongs to A upper bound of alpha”
 - While (“x belongs to A upper bound of alpha”)
 - Begin
 - $alpha = \sqrt{alpha}$ //square root of alpha
 - $x_index = x_index + 1$
 - Compute “A upper bound of alpha”
 - End
- else
 - While (“x NOT belongs to A upper bound of alpha”)
 - Begin
 - $alpha = \sqrt{alpha}$ //square of alpha
 - $x_index = x_index - 1$
 - Compute “A upper bound of alpha”
 - End
7. Return x_index

4.2 Experimental Results

For the example, the upper indices of 7 and 11 are computed as 52 and 49 respectively.

```

NeuTroN DOS-C++ 0.77, Cpu speed: max100% cycles, Frameskip 0, Program: TC
*** FUZZY WITH ONE THRESHOLD: UPPER INDEX ***
Universal set = { 2 3 4 5 6 7 8 9 10 11 }
set A = { 0.4 0.5 0.6 0.4 0.5 0.7 0.4 0.1 0.9 0.3 }
U/R set is:
2 4 6
3 7
5 8 10
9
11
Alpha value is 0.35
A[alpha] set = { 2 3 4 5 6 7 8 10 }
A_Upper[alpha] set = { 2 4 6 3 7 5 8 10 }
enter the element X in universal set to obtain upper index to X: 7
    
```

```

NeuTroN DOS-C++ 0.77, Cpu speed: max100% cycles, Frameskip 0, Program: TC
*** FUZZY WITH ONE THRESHOLD: UPPER INDEX ***
Universal set = { 2 3 4 5 6 7 8 9 10 11 }
set A = { 0.4 0.5 0.6 0.4 0.5 0.7 0.4 0.1 0.9 0.3 }
U/R set is:
2 4 6
3 7
5 8 10
9
11
Alpha value is 0.35
A[alpha] set = { 2 3 4 5 6 7 8 10 }
A_Upper[alpha] set = { 2 4 6 3 7 5 8 10 }
enter the element X in universal set to obtain upper index to X: 11_
    
```

```

NeuTroN DOS-C++ 0.77, Cpu speed: max100% cycles, Frameskip 0, Program: TC
set A = { 0.4 0.5 0.6 0.4 0.5 0.7 0.4 0.1 0.9 0.3 }
U/R set is:
2 4 6
3 7
5 8 10
9
11
Alpha value is 0.35
A[alpha] set = { 2 3 4 5 6 7 8 10 }
A_Upper[alpha] set = { 2 4 6 3 7 5 8 10 }
enter the element X in universal set to obtain upper index to X: 7
square root is 0.591608
A[alpha] set = { 4 7 10 }
A_Upper[alpha] set = { 2 4 6 3 7 5 8 10 }
square root is 0.769161
A[alpha] set = { 10 }
A_Upper[alpha] set = { 5 8 10 }
x_index is: 52_
    
```

```

NeuTroN DOS-C++ 0.77, Cpu speed: max100% cycles, Frameskip 0, Program: TC
*** FUZZY WITH ONE THRESHOLD: UPPER INDEX ***
Universal set = { 2 3 4 5 6 7 8 9 10 11 }
set A = { 0.4 0.5 0.6 0.4 0.5 0.7 0.4 0.1 0.9 0.3 }
U/R set is:
2 4 6
3 7
5 8 10
9
11
Alpha value is 0.35
A[alpha] set = { 2 3 4 5 6 7 8 10 }
A_Upper[alpha] set = { 2 4 6 3 7 5 8 10 }
enter the element X in universal set to obtain upper index to X: 11
square is 0.122500
A[alpha] set = { 2 3 4 5 6 7 8 10 11 }
A_Upper[alpha] set = { 2 4 6 3 7 5 8 10 11 }
x_index is: 49_
    
```

V. Rough Indices in a Decision Table with Fuzzy Decision Attribute

In this section, by hybridizing the algorithms described in sections 3 and 4, rough indices are obtained for each element of the Universe of discourse. Similar to the above algorithms, by applying square and/ or square root functions on the threshold of the fuzzy input A, the rough indices are obtained accordingly. The algorithm is illustrated for a decision table with a fuzzy decision attribute.

5.1 Algorithm for Rough index of an element

Algorithm (alpha, A, x)

//Algorithm to obtain index of x an element of universe of discourse

//Algorithm returns the index

1. Let x_index be an integer initialized to M
 2. Pick the equivalence class K containing x.
 3. If $U(y)=0$ for all y belongs to K
 - Begin
 - x_index = -x_index
 - goto 7
 - End
 4. If $U(y)=1$ for all y belongs to K
 - goto 7
 5. Compute "A lower bound of alpha", "A upper bound of alpha"
 6. If "x belongs to A lower bound of alpha"
 - While ("x belongs to A lower bound of alpha")
 - Begin
 - alpha= sqrt(alpha) //square root of alpha
 - x_index=x_index +1
 - Compute "A lower bound of alpha"
 - End
- else

7. If "x NOT belongs to A upper bound of alpha"

- While ("x NOT belongs to A upper bound of alpha")
 - Begin
 - alpha= sqrt(alpha) //square of alpha
 - x_index=x_index-1
 - Compute "A upper bound of alpha"
 - End

else

- Begin
- beta = alpha
- compute "A lower bound of alpha", "A upper bound of beta"
- while("x NOT belongs to A lower bound of alpha" AND "x belongs to A upper bound of alpha")
 - Begin
 - alpha = sqrt(alpha)
 - beta = sqrt(beta)
 - compute "A lower bound of alpha", "A upper bound of beta"
 - x_index=x_index+1
 - End
- If "x belongs to A lower bound of alpha"
- x_index=-x_index

End

8. Return x_index

5.2 Experimental Results

For the above example, the rough indices of 4 and 6 are computed as 51 and -51 respectively.

VI. Conclusion

In this paper, we implemented rough sets based algorithms to compute indices for the objects in fuzzy decision tables using a threshold.

VII. REFERENCES

1. B.Krishnaveni, V.Syamala, D.Latha, G.Ganesan; Characterization of Information Systems with Fuzzy and Intuitionistic Fuzzy Decision Attributes, 8th International Conference on Advanced Software Engineering & Its Applications, 2015, Korea, pp: 53-58, IEEE, 2015
2. D.Latha, D.Rekha, K.Thangadurai, G.Ganesan; Probabilistic Rough Classification in Information Systems with Fuzzy Decision Attributes, International Journal on Recent and Innovation Trends in Computing and Communication, Vol:1 Issue: 6, pp: 547-552, 2013
3. G.Ganesan, et.al.; Rough Index in Information System with Fuzziness in Decision Attributes, International journal of Fuzzy Mathematics, Vol: 17, No: 1, pp: 183-190, 2008
4. Ganesan G, et.al., Feature Selection using Fuzzy Decision Attributes, Journal of INFORMATION, Vol 9, No3, pp:381-394, 2006
5. Ganesan G et.al., Rough Set: Analysis of Fuzzy Sets using thresholds, Computational Mathematics, Narosa, India,. pp: 81-87, 2005
6. Ganesan G, et.al., An overview of rough sets, proceedings of the National Conference on the emerging trends in Pure and Applied Mathematics, Palayamkottai, India, pp: 70-76, 2005
7. Zdzislaw Pawlak, Rough Sets-Theoretical Aspects and Reasoning about Data, Kluwer Academic Publications, 1991
8. Zdzislaw Pawlak, Rough sets, International Journal of Computer and Information Sciences, 11, 341-356, 1982.

```

NeuTrON DOS-C++ 0.77, Cpu speed: max 100% cycles, Frameskip 0, Program: TC
*** FUZZY WITH ONE THRESHOLD: ROUGH INDEX ***
Universal set = { 2 3 4 5 6 7 8 9 10 11 }
set A = { 0.4 0.5 0.6 0.4 0.5 0.7 0.4 0.1 0.9 0.3 }
U/R set is:
2 4 6
3 7
5 8 10
9
11
Alpha value is 0.35
A[alpha] set = { 2 3 4 5 6 7 8 10 }
A_Lower[alpha] set = { 2 4 6 3 7 5 8 10 }
A_Upper[alpha] set = { 2 4 6 3 7 5 8 10 }
enter the element X in universal set to obtain rough index to X: 4

```

```

NeuTrON DOS-C++ 0.77, Cpu speed: max 100% cycles, Frameskip 0, Program: TC
*** FUZZY WITH ONE THRESHOLD: ROUGH INDEX ***
Universal set = { 2 3 4 5 6 7 8 9 10 11 }
set A = { 0.4 0.5 0.6 0.4 0.5 0.7 0.4 0.5 0.9 0.3 }
U/R set is:
2 4 6
3 7
5 8 10
9
11
Alpha value is 0.45
A[alpha] set = { 3 4 6 7 9 10 }
A_Lower[alpha] set = { 3 7 9 }
A_Upper[alpha] set = { 2 4 6 3 7 5 8 10 9 }
enter the element X in universal set to obtain rough index to X: 6

```

```

NeuTrON DOS-C++ 0.77, Cpu speed: max 100% cycles, Frameskip 0, Program: TC
*** FUZZY WITH ONE THRESHOLD: ROUGH INDEX ***
Universal set = { 2 3 4 5 6 7 8 9 10 11 }
set A = { 0.4 0.5 0.6 0.4 0.5 0.7 0.4 0.1 0.9 0.3 }
U/R set is:
2 4 6
3 7
5 8 10
9
11
Alpha value is 0.35
A[alpha] set = { 2 3 4 5 6 7 8 10 }
A_Lower[alpha] set = { 2 4 6 3 7 5 8 10 }
A_Upper[alpha] set = { 2 4 6 3 7 5 8 10 }
enter the element X in universal set to obtain rough index to X: 4
square root is 0.591608
A[alpha] set = { 4 7 10 }
A_Lower[alpha] set = { }
x_index is: 51_

```

```

NeuTrON DOS-C++ 0.77, Cpu speed: max 100% cycles, Frameskip 0, Program: TC
Universal set = { 2 3 4 5 6 7 8 9 10 11 }
set A = { 0.4 0.5 0.6 0.4 0.5 0.7 0.4 0.5 0.9 0.3 }
U/R set is:
2 4 6
3 7
5 8 10
9
11
Alpha value is 0.45
A[alpha] set = { 3 4 6 7 9 10 }
A_Lower[alpha] set = { 3 7 9 }
A_Upper[alpha] set = { 2 4 6 3 7 5 8 10 9 }
enter the element X in universal set to obtain rough index to X: 6
square is 0.262500, SR is 0.676820
A[alpha] set = { 2 3 4 5 6 7 8 9 10 11 }
A_Lower[alpha] set = { 2 4 6 3 7 5 8 10 9 11 }
A[beta] set = { 7 10 }
A_Upper[beta] set = { 3 7 5 8 10 }
x_index is: -51

```