

# Set-Valued Extensions of Fuzzy Logic: Classification Theorems

Gilbert Ornelas and Vladik Kreinovich

Department of Computer Science  
University of Texas at El Paso  
El Paso, Texas 79968, USA  
emails gornelas@gmail.com, vladik@utep.edu

<http://www.cs.utep.edu/vladik>  
<http://www.cs.utep.edu/interval-comp>

Fuzzy Logic Overview

Mappings Which ...

From Single-Valued ...

Reasonable Properties ...

It Is Sufficient to ...

Main Result

Discussion and ...

Auxiliary Classification ...

Discussion

Proof: Main Idea

Proof: Main Idea (cont-d)

Acknowledgments

Title Page



Page 1 of 14

Go Back

Full Screen

Close

## 1. Outline

- *Fact:* experts are often not 100% confident.
- *Traditional fuzzy logic:* use numbers from  $[0, 1]$ .
- *Problem:* an expert often cannot describe degree by a *single* number.
- *Solution:* use a set of numbers.
- *Our result:* the class of such sets coincides:
  - with all 1-point sets (i.e., with the traditional fuzzy logic), or
  - with all subintervals of  $[0, 1]$ , or
  - with all (closed) subsets of  $[0, 1]$ .
- *Conclusion:* if we want to go beyond standard fuzzy logic and still avoid sets of arbitrary complexity, we have to use *intervals*.

Fuzzy Logic: Overview

Mappings Which ...

From Single-Valued ...

Reasonable Properties ...

It Is Sufficient to ...

Main Result

Discussion and ...

Auxiliary Classification ...

Discussion

Proof: Main Idea

Proof: Main Idea (cont-d)

Acknowledgments

Title Page

◀◀ ▶▶

◀ ▶

Page 2 of 14

Go Back

Full Screen

Close

## 2. Fuzzy Logic: Brief Reminder

- *Classical (2-valued) logic*: every statement is either true or false.
- *Problem*: not adequate for expert knowledge, because experts are not fully confident about their statements.
- *Traditional fuzzy logic*: a person's degree of confidence is described by a number from the interval  $[0, 1]$ :
  - absolute confidence in a statement corresponds to 1,
  - absolute confidence in its negation corresponds to 0.
- *Operations*:
  - *we know*: the degree of confidence  $a$  in a statement  $A$  and the degree of confidence  $b$  in a statement  $B$ ,
  - *we estimate* the degree of confidence in statements  $A \wedge B$  and  $A \vee B$  as

$$a \wedge b \stackrel{\text{def}}{=} \min(a, b) \text{ and } a \vee b \stackrel{\text{def}}{=} \max(a, b).$$

Mappings Which ...

From Single-Valued ...

Reasonable Properties ...

It Is Sufficient to ...

Main Result

Discussion and ...

Auxiliary Classification ...

Discussion

Proof: Main Idea

Proof: Main Idea (cont-d)

Acknowledgments

Title Page



Page 3 of 14

Go Back

Full Screen

Close

### 3. Mappings Which Preserve Standard Fuzzy Logic Operations

- *Important:* there is no absolute scale of degrees.
- *Question:* what possible rescalings  $\varphi : [0, 1] \rightarrow [0, 1]$  preserve operations  $\wedge$  and  $\vee$ , in the sense that

$$\varphi(a) \wedge \varphi(b) = \varphi(a \wedge b) \text{ and } \varphi(a) \vee \varphi(b) = \varphi(a \vee b).$$

- *Known result:* if a bijection (1-1 onto mapping) is monotonic, then it preserves both  $\wedge$  and  $\vee$ .
- *Known result:* vice versa, if a bijection  $\varphi$  preserves the operations  $\wedge$  and  $\vee$ , then it is monotonic.
- *Terminology:* a strictly monotonic continuous function from  $[0, 1]$  to  $[0, 1]$  for which  $\varphi(0) = 0$  and  $\varphi(1) = 1$  is thus an *automorphism* of the structure  $([0, 1], \wedge, \vee)$ .
- The set of all automorphisms is called the *automorphism group* of the structure  $([0, 1], \wedge, \vee)$ .

Mappings Which ...

From Single-Valued ...

Reasonable Properties ...

It Is Sufficient to ...

Main Result

Discussion and ...

Auxiliary Classification ...

Discussion

Proof: Main Idea

Proof: Main Idea (cont-d)

Acknowledgments

Title Page



Page 4 of 14

Go Back

Full Screen

Close

## 4. From Single-Valued Fuzzy Logic to Interval-Valued and Set-Valued Ones

- *Need for sets: reminder.*
  - An expert often cannot describe his or her degree by a single number.
  - It is therefore reasonable to describe this degree by, e.g., a *set* of possible values (e.g., an interval).
- *Operations on sets: motivation:*
  - a set  $A$  means that all values  $a \in A$  are possible,
  - $B$  means that all the values  $b \in B$  are possible;
  - so, the set  $A \wedge B$  of possible values of  $a \wedge b$  is formed by all the values  $a \wedge b$  where  $a \in A$  and  $b \in B$ :

$$A \wedge B \stackrel{\text{def}}{=} \{a \wedge b : a \in A, b \in B\}.$$

- Similarly,  $A \vee B \stackrel{\text{def}}{=} \{a \vee b : a \in A, b \in B\}.$

Fuzzy Logic: Overview

Mappings Which ...

From Single-Valued ...

Reasonable Properties ...

It Is Sufficient to ...

Main Result

Discussion and ...

Auxiliary Classification ...

Discussion

Proof: Main Idea

Proof: Main Idea (cont-d)

Acknowledgments

Title Page

◀ ▶

◀ ▶

Page 5 of 14

Go Back

Full Screen

Close

## 5. Reasonable Properties of Set Extensions

- *Problem:* we want to allow sets from a given class  $\mathcal{S}$ .
- *We want an extension of the traditional fuzzy logic:*  $\mathcal{S}$  must contain all one-element sets.
- *We want invariance:* if  $S \in \mathcal{S}$ , and  $\varphi(x)$  is an automorphism, then the image  $\varphi(S) = \{\varphi(s) : s \in S\}$  should also be possible, i.e.,  $\varphi(S) \in \mathcal{S}$ .
- *We want closure* under naturally defined  $\wedge$  and  $\vee$ .
- *Situation:*  $S \in \mathcal{S}$ , values  $s_1, s_2, \dots, s_k, \dots$  are all possible (i.e.,  $s_k \in S$ ), and  $s_k \rightarrow s$ .
- *Analysis:* no matter how accurately we compute  $s$ , we will always find  $s_k$  that is indistinguishable from  $s$ .
- *Conclusion:* it is natural to assume that this limit value  $s$  is also possible, i.e., that every set  $S \in \mathcal{S}$  be closed.

Fuzzy Logic: Overview

Mappings Which ...

From Single-Valued ...

Reasonable Properties ...

It Is Sufficient to ...

Main Result

Discussion and ...

Auxiliary Classification ...

Discussion

Proof: Main Idea

Proof: Main Idea (cont-d)

Acknowledgments

Title Page

◀◀ ▶▶

◀ ▶

Page 6 of 14

Go Back

Full Screen

Close

## 6. It Is Sufficient to Consider Closed Classes of Sets

- *Known:* on the class of all bounded closed sets, there is a natural metric – Hausdorff distance  $d_H(S, S')$ .
- *Definition:* the smallest  $\varepsilon > 0$  for which  $S$  is contained in the  $\varepsilon$ -neighborhood of  $S'$  and  $S'$  is contained in the  $\varepsilon$ -neighborhood of  $S$ .
- *Interpretation:* if  $d_H(S, S') \leq \varepsilon$ , and we only know the values  $s \in S$  and  $s' \in S'$  with accuracy  $\varepsilon$ , then we cannot distinguish between the sets  $S$  and  $S'$ .
- *Situation:*  $S_1, S_2, \dots, S_k, \dots$  are all possible ( $S_i \in \mathcal{S}$ ), and  $d_H(S_k, S) \rightarrow 0$ .
- *Analysis:* no matter how accurately we compute the values, we will always find a set  $S_k$  that is indistinguishable from the set  $S$  (and possible).
- *Conclusion:* the limit set  $S$  is also possible, i.e.,  $\mathcal{S}$  is *closed* under the Hausdorff metric.

Fuzzy Logic: Overview

Mappings Which ...

From Single-Valued ...

Reasonable Properties ...

It Is Sufficient to ...

Main Result

Discussion and ...

Auxiliary Classification ...

Discussion

Proof: Main Idea

Proof: Main Idea (cont-d)

Acknowledgments

Title Page

◀◀

▶▶

◀

▶

Page 7 of 14

Go Back

Full Screen

Close

## 7. Main Result

**Definition 1.** *A class  $\mathcal{S}$  of closed non-empty subsets of the interval  $[0, 1]$  is called a set-valued extension of fuzzy logic if it satisfies the following conditions:*

- (i) the class  $\mathcal{S}$  contains all 1-element sets  $\{s\}$ ,  $s \in [0, 1]$ ;*
- (ii) the class  $\mathcal{S}$  is closed under “and” and “or” operations;*
- (iii) the class  $\mathcal{S}$  is closed under arbitrary automorphisms;*
- (iv) the class  $\mathcal{S}$  is closed under Hausdorff metric.*

**Theorem 1.** *Every set-valued extension of fuzzy logic coincides with one of the following three classes:*

- the class  $P$  of all one-point sets  $\{s\}$ ;*
- the class  $I$  of all subintervals  $[\underline{s}, \bar{s}] \subseteq [0, 1]$  of the interval  $[0, 1]$ ;*
- the class  $C$  of all closed subsets  $S$  of the interval  $[0, 1]$ .*

Mappings Which ...

From Single-Valued ...

Reasonable Properties ...

It Is Sufficient to ...

Main Result

Discussion and ...

Auxiliary Classification ...

Discussion

Proof: Main Idea

Proof: Main Idea (cont-d)

Acknowledgments

Title Page



Page 8 of 14

Go Back

Full Screen

Close

## 8. Discussion and Auxiliary Results

- *Main result in plain English:* if we do not want arbitrarily complex sets, we must restrict ourselves to intervals.
- *We required:* that all single-valued fuzzy sets are possible.
- *Problem:* as we mentioned, single values are not realistic.
- *Question:* what if we do not make this requirement?
- *First case:* the class  $\mathcal{S}$  contains a set  $S$  which contains neither 0 nor 1.
- *Result:* same as before.
- *Remaining case:* every  $S \in \mathcal{S}$  contains 0 or 1.
- *Result:* new classification theorem.

Fuzzy Logic: Overview

Mappings Which ...

From Single-Valued ...

Reasonable Properties ...

It Is Sufficient to ...

Main Result

Discussion and ...

Auxiliary Classification ...

Discussion

Proof: Main Idea

Proof: Main Idea (cont-d)

Acknowledgments

Title Page

◀◀ ▶▶

◀ ▶

Page 9 of 14

Go Back

Full Screen

Close

## 9. Auxiliary Classification Theorem

If every  $S \in \mathcal{S}$  contains 0 or 1, then the class  $\mathcal{S}$  is a union of one or more of the following classes:

- the class consisting of a single set  $\{0\}$ ;
- the class consisting of a single set  $\{1\}$ ;
- the class consisting of a single interval  $[0, 1]$ ;
- the class  $I_0$  of all subintervals of type  $[0, \bar{s}]$ ;
- the class  $I_1$  of all subintervals of type  $[\underline{s}, 1]$ ;
- the class  $I_{01}$  of all sets  $S \subseteq [0, 1]$  of the type  $[0, \underline{s}] \cup [\bar{s}, 1]$ ;
- the class  $C_0$  of all closed subsets  $S \subseteq [0, 1]$  s.t.  $0 \in S$ ;
- the class  $C_1$  of all closed subsets  $S \subseteq [0, 1]$  s.t.  $1 \in S$ ;
- the class  $C_{01}$  of all closed subsets  $S \subseteq [0, 1]$  which contain both 0 and 1.

Mappings Which ...

From Single-Valued ...

Reasonable Properties ...

It Is Sufficient to ...

Main Result

Discussion and ...

Auxiliary Classification ...

Discussion

Proof: Main Idea

Proof: Main Idea (cont-d)

Acknowledgments

Title Page



Page 10 of 14

Go Back

Full Screen

Close

## 10. Discussion

- *Particular case:* 3-valued logic: true = 1, false = 0, and unknown =  $[0, 1]$ .
- *Particular case:* classical logic  $\mathcal{S} = \{\{0\}, \{1\}\}$ .
- *All other cases:* we have either intervals or arbitrarily complex closed set.
- *Conclusion:* if we do not want arbitrarily complex sets, we must restrict ourselves to intervals.
- *Natural generalization:* from sets to fuzzy numbers (type-2 fuzzy sets). Result:
  - if  $\mathcal{S}$  contains *at least one* strictly monotonic fuzzy number and
  - $\mathcal{S}$  is invariant under automorphisms and Hausdorff closed,
  - then  $\mathcal{S}$  contains *all* fuzzy numbers.

Fuzzy Logic Overview

Mappings Which ...

From Single-Valued ...

Reasonable Properties ...

It Is Sufficient to ...

Main Result

Discussion and ...

Auxiliary Classification ...

Discussion

Proof: Main Idea

Proof: Main Idea (cont-d)

Acknowledgments

Title Page

◀◀ ▶▶

◀ ▶

Page 11 of 14

Go Back

Full Screen

Close

## 11. Proof: Main Idea

- It is enough to consider case when  $\mathcal{S}$  contains at least one non-1-point set.
- If  $\mathcal{S}$  contains a non-degenerate interval  $[\underline{s}, \bar{s}]$ , then automorphisms can move it close to  $[0, 1]$ .
- Due to Hausdorff-closeness,  $[0, 1] \in \mathcal{S}$ .
- Hence  $[a, b] = ([0, 1] \vee \{a\}) \wedge \{b\} \in \mathcal{S}$  for all  $a < b$ .
- Let  $S \in \mathcal{S}$  be not an interval, then  $s_0 \notin S$  for some  $s_0 \in [\inf S, \sup S]$ .
- Since  $S$  is closed, the whole neighborhood  $(s_0 - \varepsilon, s_0 + \varepsilon)$  is outside  $S$ .
- An automorphism can move  $s_0 - \varepsilon$  close to 0, and  $s_0 + \varepsilon$  close to 1.
- Due to Hausdorff-closeness,  $\{0, 1\} \in \mathcal{S}$ .

Mappings Which ...

From Single-Valued ...

Reasonable Properties ...

It Is Sufficient to ...

Main Result

Discussion and ...

Auxiliary Classification ...

Discussion

Proof: Main Idea

Proof: Main Idea (cont-d)

Acknowledgments

Title Page



Page 12 of 14

Go Back

Full Screen

Close

## 12. Proof: Main Idea (cont-d)

- We have just proved:  $\{0, 1\} \in \mathcal{S}$ .
- Hence,  $\{0, 1\} \wedge \{p_n\} = \{0, p_n\} \in \mathcal{S}$ .
- Here,

$$\{0, p_{n-k}, p_{(n-k)+1}, \dots, p_n\} \vee \{0, p_{n-k-1}\} = \\ \{0, p_{n-k-1}, p_{n-k}, p_{(n-k)+1}, \dots, p_n\}.$$

- So, by induction over  $k$ , we have  $\{0, p_1, p_2, \dots, p_n\} \in \mathcal{S}$ .
- Hence,  $\{p_1, p_2, \dots, p_n\} = \{p_1\} \vee \{0, p_1, p_2, \dots, p_n\} \in \mathcal{S}$ .
- *Conclusion:* every finite set is in  $\mathcal{S}$ .
- *Known fact:* every closed set is a limit of finite sets.
- *Conclusion:* every closed set is in  $\mathcal{S}$ .

Mappings Which ...

From Single-Valued ...

Reasonable Properties ...

It Is Sufficient to ...

Main Result

Discussion and ...

Auxiliary Classification ...

Discussion

Proof: Main Idea

Proof: Main Idea (cont-d)

Acknowledgments

Title Page

◀◀

▶▶

◀

▶

Page 13 of 14

Go Back

Full Screen

Close

## 13. Acknowledgments

This work was supported in part:

- by NSF grants EAR-0225670 and DMS-0532645 and
- by Texas Department of Transportation grant No. 0-5453.

The authors are thankful:

- to Carol and Elbert Walkers for valuable discussions, and
- to the anonymous referees for important suggestions.

Outline

Fuzzy Logic: Brief...

Mappings Which...

From Single-Valued...

Reasonable Properties...

It Is Sufficient to...

Main Result

Discussion and...

Auxiliary Classification...

Discussion

Proof: Main Idea

Proof: Main Idea (cont-d)

Acknowledgments

Title Page



Page 14 of 14

Go Back

Full Screen

Close

Quit