

# **On Mathematical Fuzzy Logic**

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## A little bit of history: fuzzy logic

- Zadeh 1965
  - Goguen 1967
  - Lee 1972
  - Mamdani 1974
  - Bandler, Kohout 1980
  - Trillas, Valverde 1985
  - Klir, Folger 1988
  - Zimmermann 1991
- ⋮

## A little bit of history: many-valued logic

- Łukasiewicz 1920
- Łukasiewicz - Tarski 1930
- Gödel 1932
- Moisil 1940
- Rose - Rosser 1958
- Chang 1959
- Dummett 1959
- Belluce - Chang 1963
- Horn 1969
- Ragaz 1981
- Mundici 1987, 1993
- Gottwald 1988
- ⋮

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- Pavelka 1979
- Pulr 1984
- Takeuti-Titani 1984, 1992
- Novák 1990
- Gottwald 1993
- Hájek-Esteva-Godo 1996

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Subject classification: 03

Publication Type: All

Citations to display: 10

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**Primary Classification**

03 (1980-now) Mathematical logic and foundations

03B (1980-now) General logic

03B52 (1980-now) Fuzzy logic; logic of vagueness [See also 68T27, 68T37, 94D05]

Citations	Publication
570	<b>MR1321597 (96e:03057)</b> Kechris, Alexander S. Classical descriptive set theory. <i>Graduate Texts in Mathematics</i> , 156. Springer-Verlag, New York, 1995. xviii+402 pp. ISBN: 0-387-94374-9 (Reviewer: Jakub Jasiński), 03E15 (03-01 03-02 04A15 28A05 54H05 90D44)
442	<b>MR0882921 (88m:03003)</b> Soare, Robert I. Recursively enumerable sets and degrees. A study of computable functions and computably generated sets. <i>Perspectives in Mathematical Logic</i> . Springer-Verlag, Berlin, 1987. xviii+437 pp. ISBN: 3-540-15299-7 (Reviewer: Peter G. Hinman), 03-02 (03D20 03D25 03D30)
372	<b>MR0597342 (82f:03001)</b> Kunen, Kenneth Set theory. An introduction to independence proofs. <i>Studies in Logic and the Foundations of Mathematics</i> , 102. North-Holland Publishing Co., Amsterdam-New York, 1980. xvi+313 pp. ISBN: 0-444-85401-0 (Reviewer: U. Felgner), 03-02 (03E35 03Exx 04-02)
324	<b>MR1221741 (94e:03002)</b> Hodges, Wilfrid Model theory. <i>Encyclopedia of Mathematics and its Applications</i> , 42. Cambridge University Press, Cambridge, 1993. xiv+772 pp. ISBN: 0-521-30442-3 (Reviewer: J. M. Plotkin), 03-01 (03-02 03Cxx)
323	<b>MR0506523 (80a:03062)</b> Jech, Thomas Set theory. Pure and Applied Mathematics. Academic Press [Harcourt Brace Jovanovich, Publishers], New York-London, 1978. xi+621 pp. ISBN: 0-12-381950-4 (Reviewer: E. Mendelson), 03Exx (04-02)
228	<b>MR1633348 (99j:03001)</b> van den Dries, Lou Tame topology and o-minimal structures. <i>London Mathematical Society Lecture Note Series</i> , 248. Cambridge University Press, Cambridge, 1998. x+180 pp. ISBN: 0-521-59838-9 (Reviewer: O. V. Belegradek), 03-02 (03C50 03C60 14P10 52-02 54-02 55-02 57-02)
208	<b>MR1900263 (2003c:03048)</b> Hájek, Petr Metamathematics of fuzzy logic. <i>Trends in Logic—Studia Logica Library</i> , 4. Kluwer Academic Publishers, Dordrecht, 1998. viii+297 pp. ISBN: 0-7923-5238-6 (Reviewer: Siegfried Johannes Gottwald (Zbl 0937.03030)), 03B52 (03-02 03B50 03D35 03G10)
208	<b>MR1059055 (91c:03026)</b> Chang, C. C.; Keisler, H. J. Model theory. Third edition. <i>Studies in Logic and the Foundations of Mathematics</i> , 73. North-Holland Publishing Co., Amsterdam, 1990. xvi+650 pp. ISBN: 0-444-88054-2, 03Cxx (03-01 03C57 03C95 03H05)
193	<b>MR1350295 (96k:03002)</b> Bartoszyński, Tomek; Judah, Haim Set theory. On the structure of the real line. A K Peters, Ltd., Wellesley, MA, 1995. xii+546 pp. ISBN: 1-56881-044-X (Reviewer: Eva Coplakova), 03-02 (03Exx)
182	<b>MR0899269 (89m:03057)</b> Girard, Jean-Yves Linear logic. <i>Theoret. Comput. Sci.</i> 50 (1987), no. 1, 101 pp. (Reviewer: G. E. Mints), 03F50 (03B70 68Q99)

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# Mathematical fuzzy logic

## Łukasiewicz logic Ł

Connectives: implication  $\rightarrow$  and ‘falsum’  $\perp$  (we set  $\neg\varphi = \varphi \rightarrow \perp$ )

(Standard) semantics: evaluation is a mapping  $e: \text{FOR} \rightarrow [0, 1]$  st:

$$e(\perp) = 0 \quad e(\varphi \rightarrow \psi) = \min\{1, 1 - e(\varphi) + e(\psi)\}$$

Tautologies: formulae *always* evaluated to 1

Theorems: formulae derived (in the usual way) using *Modus Ponens* (from  $\varphi$  and  $\varphi \rightarrow \psi$  infer  $\psi$ ) from the axioms:

$$\begin{aligned} & \varphi \rightarrow (\psi \rightarrow \varphi) \\ & (\varphi \rightarrow \psi) \rightarrow ((\psi \rightarrow \chi) \rightarrow (\varphi \rightarrow \chi)) \\ & (\neg\varphi \rightarrow \neg\psi) \rightarrow (\psi \rightarrow \varphi) \\ & ((\varphi \rightarrow \psi) \rightarrow \psi) \rightarrow ((\psi \rightarrow \varphi) \rightarrow \varphi) \end{aligned}$$

Completeness:  $\text{Thm}(\mathcal{L}) = \text{Taut}(\mathcal{L})$

## Multitude of fuzzy logics

Fuzzy logics in ‘full language’ ( $\rightarrow, \rightsquigarrow, \&, \wedge, \vee, 0, 1, \perp, \top$ ):  $\textcolor{red}{\mathcal{L}}$ ,  $\textcolor{red}{G}$ ,  $\Pi$ ,  $\textcolor{red}{BL}$ ,  $SBL$ ,  $WCBL$ ,  $\textcolor{red}{MTL}$ ,  $IMTL$ ,  $SMTL$ ,  $WNM$ ,  $NM$ ,  $WCMTL$ ,  $\Pi MTL$ ,  $\textcolor{red}{psMTL}^r$ ,  $\textcolor{red}{psBL}^r$ ,  $\textcolor{red}{UL}$ ,  $IUL$ ,  $ULM$ ,  $\textcolor{red}{psUL}$ , ...

We have families of their extensions:  $\mathcal{L}_n$ ,  $\mathcal{L}_{\leq n}$ ,  $C_n \mathcal{L}$ ,  $S_n \mathcal{L}$ , ...

We can add truth constants: just distinguished ones like  $\frac{1}{2}$ ,  
all rationals, or from a set  $\mathcal{C} \subseteq [0, 1]$

We can add unary connectives:  $\Delta$ ,  $\sim$ ,  $\delta_n$ ,  $vt$ ,  $st$ , ...

We can add binary connectives:  $\odot$ ,  $\rightarrow_{\Pi}$ , ...

We can study fragments: pure implicational,  $\perp$ -free, ...

## Consequence relations

Semantically:  $T \models_{\text{Ł}} \varphi$  if for each evaluation s.t.  $e[T] \subseteq \{1\}$   
also  $e(\varphi) = 1$

Syntactically:  $T \vdash_{\text{Ł}} \varphi$  if there is a proof using formulae of  $T$   
as special axioms

1st problem: equivalence ' $T \models_{\text{Ł}} \varphi$  iff  $T \vdash_{\text{Ł}} \varphi$ ' holds for *finite*  $T$  only

2nd problem: consider rule from  $\varphi \rightarrow \neg\varphi$  and  $\neg\varphi \rightarrow \varphi$  infer  $\perp$ .

- $\varphi \rightarrow \neg\varphi, \neg\varphi \rightarrow \varphi \not\vdash_{\text{Ł}} \perp$
- if we add it as a new inference rule to Łukasiewicz logic we get  
**no new theorems**

PC, G. Metcalfe. *Structural Completeness in Fuzzy Logics*. Notre Dame J. of Formal Logic, 50(2):153–183, 2009

## Abstract study of fuzzy logics: semilinearity

PC, C. Noguera. *Implicational (semilinear) logics I: a new hierarchy*. Archive for Mathematical Logic, 49:417–446, 2010

Fact: any logic (as consequence relation) has its algebraic (matrix) semantics

An implicational logic has ‘nice’ implication connective which defines order in its algebras

A semilinear logic is complete w.r.t. its algebras which are linearly ordered

It a mathematical *approximation* of the notion of *fuzzy* logic as used in the literature.

## Abstract study of fuzzy logics: density

Being complete w.r.t. all chains need not be enough: we sometimes want completeness w.r.t. better classes of chains (in extreme w.r.t. just one particular algebra as in the case of Łukasiewicz logic)

A. Ciabattoni, G. Metcalfe. *Density elimination*. Theoretical Computer Science, 403(2-3):328–346, 2008

## Adding truth constants

F. Esteva, L. Godo, C. Noguera. *First-order t-norm based fuzzy logics with truth-constants: distinguished semantics and completeness*. Annals of Pure and Applied Logic, 161:185–202, 2009

Z. Haniková. *Logics with truth constants for delimiting idempotents*. Submitted

# First-order fuzzy logic

## Decidability and arithmetical hierarchy

- F. Montagna, C. Noguera. *Arithmetical complexity of first-order predicate fuzzy logics over distinguished semantics*. Journal of Logic and Computation, 20:399–424, 2010
- P. Hájek. *Comments on interpretability, decidability and other topics on fuzzy logic*. To appear in J. of Logic and Comp.
- M. Baaz, A. Ciabattoni, N. Preining. *SAT in Monadic Gödel Logics: a borderline between decidability and undecidability*. In Proc. of the 16th LLIC, LNCS, 5514:113–124, 2009.

## Model theory

- P. Dellunde. *Preserving Mappings in Fuzzy Predicate Logics*. To appear in Journal of Logic and Computation.
- M. Baaz, G. Metcalfe. *Herbrand Theorems and Skolemization for Fuzzy Logics*. In Proceedings of CiE 2008, LNCS vol, 5028, pp. 22–31, Springer, 2008

## First-order fuzzy logic cont.

### Proof theory

- M. Baaz, A. Ciabattoni, C. Fermüller. *Cut Elimination for First Order Gödel Logic by Hyperclause Resolution* In Proceedings of the 15th LPAR, LNCS, vol. 5530, pp. 451–466, 2008
- A. Ciabattoni, N. Galatos, K. Terui. *From Axioms to Analytic Rules in Nonclassical Logics*. In Logic in Computer Science, pp. 229–240, IEEE, 2008

### Fuzzy description logics

- F. Bobillo, F. Bou, U. Straccia. *On the Failure of Finite Model Property in some Fuzzy Description Logics*. Fuzzy Sets and Systems, 171:1–12, 2011
- A. Garcia-Cerdaña, E. Armengol, F. Esteva. *Fuzzy Description Logics and t-norm based Fuzzy Logics*. To appear in Int. J. of Approximate Reasoning.

## Modalities in fuzzy logics

- P. Hájek. *On the fuzzy modal logic S5(C)*. To appear in Fuzzy Sets and Systems.
- F. Bou, F. Esteva, L. Godo, R. Rodriguez. *On the Minimum Many-Valued Modal Logic over a Finite Residuated Lattice*. To appear in Journal of Logic and Computation, 2010
- G. Metcalfe, N. Olivetti. *Proof Systems for a Gödel Modal Logic*. In proc. of TABLEAUX 2009, LNCS, vol. 5607, pp. 265-279, 2009

# **Handbook of Mathematical Fuzzy Logic**

- edited by: P. Cintula, P. Hájek, C. Noguera
- to be publish in College Publication
- 11 chapters by 19 authors (11 from LoMoReVI!)
- 900+ pages in 2 volumes
- purely mathematical and theoretical work: no philosophy, linguistics, or applications.

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