



INVESTICE DO ROZVOJE VZDĚLÁVÁNÍ



Fuzzy stable  
models:  
definition,  
existence,  
uniqueness

Manuel  
Ojeda-Aciego

Introduction

Normal Logic  
Programs

Existence  
results

Uniqueness  
results

# Fuzzy stable models: definition, existence, uniqueness

Nicolás Madrid

*Univ of Cádiz*

Manuel Ojeda-Aciego

*Univ of Málaga*

Olomouc, March 5, 2012



# On the context of our research

FEAST, supported by Spanish Ministry of Science

Fuzzy stable  
models:  
definition,  
existence,  
uniqueness

Manuel  
Ojeda-Aciego

Introduction

Normal Logic  
Programs

Existence  
results

Uniqueness  
results

## Foundations and Extensions of Answer Set Technology

- 1 Logical foundations of ASP
- 2 Extensions of its language in order to accommodate uncertainty and/or temporal and modal operators.
- 3 Reasoning methods aimed at specifying and verifying protocols of virtual organizations.



# On the context of our research

FEAST, supported by Spanish Ministry of Science

Fuzzy stable  
models:  
definition,  
existence,  
uniqueness

Manuel  
Ojeda-Aciego

Introduction

Normal Logic  
Programs

Existence  
results

Uniqueness  
results

- Generalized algebraic structures (hyperalgebra) to formalize approximate reasoning with incomplete, uncertain, and/or imprecise information.
- Multi-adjoint approach to formal concept analysis
- Qualitative reasoning
- Modal  $\times$  temporal logics
- Equilibrium logic
- Other applied logics aimed at temporal, causal, fuzzy extensions of ASP.



# Outline of the talk

Fuzzy stable  
models:  
definition,  
existence,  
uniqueness

Manuel  
Ojeda-Aciego

Introduction

Normal Logic  
Programs

Existence  
results

Uniqueness  
results

- We recall the *fuzzy answer set semantics* for normal (and extended) residuated logic programs
- The, introduce conditions which ensure existence and uniqueness of fuzzy stable models.
- It is worth to stress the intensive use of results in real analysis and vector calculus.



# Preliminaries

Fuzzy stable  
models:  
definition,  
existence,  
uniqueness

Manuel  
Ojeda-Aciego

Introduction

Normal Logic  
Programs

Existence  
results

Uniqueness  
results

## Definition

A *residuated lattice* is a tuple  $(L, \leq, *, \leftarrow)$  such that:

- 1  $(L, \leq)$  is a complete bounded lattice, with top and bottom elements 1 and 0.
- 2  $(L, *, 1)$  is a commutative monoid with unit element 1.
- 3  $(*, \leftarrow)$  forms an adjoint pair, i.e.  $z \leq (x \leftarrow y)$  iff  $y * z \leq x \quad \forall x, y, z \in L$ .

## Definition

A negation operator, over  $(L, \leq, *, \leftarrow)$ , is any decreasing mapping  $n: L \rightarrow L$  satisfying  $n(0) = 1$  and  $n(1) = 0$ .

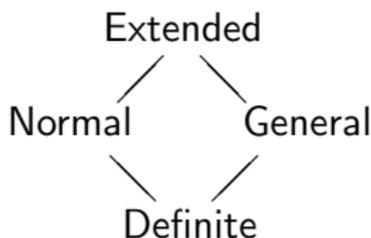


# Types of programs according to negation

An extended residuated logic program  $\mathbb{P}$  is said to be:

- *definite*, or *positive*, if it does not contain negation operators.
- *normal* if it does not contain **strong** negation.
- *general* if it does not contain **default** negation.

At least these two negations are needed to cope with information at a practical level.



Fuzzy stable  
models:  
definition,  
existence,  
uniqueness

Manuel  
Ojeda-Aciego

Introduction

Normal Logic  
Programs

Existence  
results

Uniqueness  
results



# Normal logic programs

## Syntax

Fuzzy stable models:  
definition,  
existence,  
uniqueness

Manuel  
Ojeda-Aciego

Introduction

Normal Logic  
Programs

Existence  
results

Uniqueness  
results

### Definition

Given a residuated lattice with negation  $(L, *, \leftarrow, \neg)$  an *normal residuated logic program*  $\mathbb{P}$  is a set of weighted rules of the form

$$\langle p \leftarrow p_1 * \dots * p_m * \neg p_{m+1} * \dots * \neg p_n; \vartheta \rangle$$

where  $\vartheta$  is an element of  $L$  and  $p, p_1, \dots, p_n$  are propositional symbols.

### Definition

A positive residuated logic program is a normal residuated logic program *without* default negation.



# Normal logic programs

## Semantics

Fuzzy stable  
models:  
definition,  
existence,  
uniqueness

Manuel  
Ojeda-Aciego

Introduction

Normal Logic  
Programs

Existence  
results

Uniqueness  
results

Rules will be frequently denoted as  $\langle p \leftarrow \mathcal{B}; \vartheta \rangle$ . As usual, the formula  $\mathcal{B}$  is called the *body* of the rule whereas  $p$  is called its *head*.

### Definition

A fuzzy  $L$ -interpretation is a mapping  $I: \Pi \rightarrow L$ .

$I$  satisfies a rule  $\langle p \leftarrow \mathcal{B}; \vartheta \rangle$  if and only if  $I(\mathcal{B}) * \vartheta \leq I(p)$  or, equivalently,  $\vartheta \leq I(p \leftarrow \mathcal{B})$ .

$I$  is a *model* of  $\mathbb{P}$  if it satisfies all rules in  $\mathbb{P}$ .



# Positive Logic Programs

The minimal model

Fuzzy stable models:  
definition,  
existence,  
uniqueness

Manuel  
Ojeda-Aciego

Introduction

Normal Logic  
Programs

Existence  
results

Uniqueness  
results

## Definition

Let  $\mathbb{P}$  be a **positive** residuated logic program and let  $I$  be an interpretation. The immediate consequence operator of  $I$  wrt  $\mathbb{P}$  is the interpretation defined as follows:

$$T_{\mathbb{P}}(I)(p) = \sup\{I(\mathcal{B}) * \vartheta : \langle p \leftarrow \mathcal{B}; \vartheta \rangle \in \mathbb{P}\}$$

## Theorem

*Every **positive** program has a least model, which coincides with the least fix point of  $T_{\mathbb{P}}(-)$ . Hence, the least model of  $\mathbb{P}$  is denoted by  $\text{lfp}(T_{\mathbb{P}})$ .*



# The reduct of $\mathbb{P}$ w.r.t an $L$ -interpretation.

Fuzzy stable models:  
definition,  
existence,  
uniqueness

Manuel  
Ojeda-Aciego

Introduction

Normal Logic  
Programs

Existence  
results

Uniqueness  
results

Let  $\mathbb{P}$  and  $I$  be a **normal** residuated logic program and a  $L$ -interpretation respectively, we will construct a new **positive** program  $\mathbb{P}_I$  by substituting each rule in  $\mathbb{P}$  of the form:

$$\langle p \leftarrow p_1 * \dots * p_m * \neg p_{m+1} * \dots * \neg p_n; \vartheta \rangle$$

by the rule

$$\langle p \leftarrow p_1 * \dots * p_m; \neg I(p_{m+1}) * \dots * \neg I(p_n) * \vartheta \rangle$$

## Definition

The program  $\mathbb{P}_I$  is called the reduct of  $\mathbb{P}$  wrt the interpretation  $I$ .



# Fuzzy Answer Sets

Fuzzy stable  
models:  
definition,  
existence,  
uniqueness

Manuel  
Ojeda-Aciego

Introduction

Normal Logic  
Programs

Existence  
results

Uniqueness  
results

## Definition

Let  $\mathbb{P}$  be a general residuated logic program, an  $L$ -interpretation  $I$  is said to be a **fuzzy answer set** (or **fuzzy stable model**) of  $\mathbb{P}$  iff  $I$  is the least model of  $\mathbb{P}_I$ .

## Proposition

*Let  $\mathbb{P}$  be a positive residuated logic program. Then the unique fuzzy answer set of  $\mathbb{P}$  is the least model of  $\mathbb{P}$ .*

## Theorem

*Any fuzzy answer set of  $\mathbb{P}$  is a **minimal model** of  $\mathbb{P}$ .*



# Inconsistent Programs Exist

Fuzzy stable  
models:  
definition,  
existence,  
uniqueness

Manuel  
Ojeda-Aciego

Introduction

Normal Logic  
Programs

Existence  
results

Uniqueness  
results

## Remark

*Not every normal program has fuzzy answer sets.*

For example, if we consider  $L = [0, 1]$  and the negation operator

$$n_{0.4}(x) = \begin{cases} 0 & \text{if } x \geq 0.4 \\ 1 & \text{if } x < 0.4 \end{cases}$$

the program  $\mathbb{P} = \langle p \leftarrow \neg p ; 0.7 \rangle$  has not fuzzy answer sets.

## Definition

A general residuated logic program  $\mathbb{P}$  is **consistent** if there is a fuzzy answer set of  $\mathbb{P}$ . Otherwise,  $\mathbb{P}$  is inconsistent.



# Existence of fuzzy stable models

Case  $L = [0, 1]$

Fuzzy stable models:  
definition,  
existence,  
uniqueness

Manuel  
Ojeda-Aciego

Introduction

Normal Logic  
Programs

Existence  
results

Uniqueness  
results

The existence of stable models can be guaranteed by simply imposing conditions on the underlying residuated lattice:

## Theorem

*Let  $\mathcal{L} \equiv ([0, 1], \leq, *, \leftarrow, \neg)$  be a residuated lattice with negation. If  $*$  and  $\neg$  are continuous, then every finite normal program  $\mathbb{P}$  defined over  $\mathcal{L}$  has at least a fuzzy stable model.*

## Proof (sketch).

The idea is to apply Brouwer's fix-point theorem to the operator  $\mathcal{R}(I) = \text{Ifp}(T_{\mathbb{P}_I})$ , which is proved to be continuous. Operator  $\mathcal{R}$  can be seen as a composition of two operators  $\mathcal{F}_1(I) = \mathbb{P}_I$  and  $\mathcal{F}_2(\mathbb{P}) = \text{Ifp}(T_{\mathbb{P}})$ . Both  $\mathcal{F}_1$  and  $\mathcal{F}_2$  are proved to be continuous. □



# Existence of fuzzy stable models

Case  $L = [0, 1]$

Fuzzy stable models:  
definition,  
existence,  
uniqueness

Manuel  
Ojeda-Aciego

Introduction

Normal Logic  
Programs

Existence  
results

Uniqueness  
results

## Key points of the proof

- 1  $\mathcal{F}_1$  can be interpreted as an operator from the set of  $[0, 1]$ -interpretations to the Euclidean space  $[0, 1]^k$  where  $k$  is the number of rules in  $\mathbb{P}$ . Continuity follows from hypotheses.
- 2  $\mathcal{F}_2$  can be seen as a function from  $[0, 1]^k$  to the set of interpretations, which can be seen as a finite composition of continuous operators. Thus,  $\mathcal{F}_2$  is also continuous.
- 3 Hence we can apply Brouwer's fix-point theorem to  $\mathcal{R}(I)$  and ensure that it has at least a fix-point.
- 4 To conclude, we only have to note that every fix-point of  $\mathcal{R}(I)$  is actually a fuzzy answer set of  $\mathbb{P}$ .



# Uniqueness of fuzzy stable models

Case  $L = [0, 1]$  and product t-norm

For finite programs, the operator  $T_{\mathbb{P}}$  can be seen as a real function from  $[0, 1]^n$  to  $[0, 1]^n$  where  $n = \#\Pi_{\mathbb{P}}$ .

## Lemma

Let  $\mathbb{P}$  be a normal residuated logic program such that at most one rule which head is  $p$  appears in  $\mathbb{P}$ . Let  $I$  and  $J$  be two  $[0, 1]$ -interpretations such that  $J \leq I$ , then:

$$\sum_{j=1}^n \left| \frac{\partial (T_{\mathbb{P}})_i}{\partial p_j} (J(p_1), \dots, J(p_n)) \right| \leq$$

$$\sum_{j=1}^h I(q_1) \cdot \dots \cdot I(q_{j-1}) \cdot I(q_{j+1}) \cdot \dots \cdot I(q_h) \cdot \vartheta +$$

$$+ (k - h) (I(q_1) \cdot \dots \cdot I(q_h) \cdot \vartheta)$$

where  $\langle p_i \leftarrow q_1 * \dots * q_h * \neg q_{h+1} * \dots * \neg q_k ; \vartheta \rangle$  is the rule in  $\mathbb{P}$  whose head is  $p_i$ .

Fuzzy stable models:  
definition,  
existence,  
uniqueness

Manuel  
Ojeda-Aciego

Introduction

Normal Logic  
Programs

Existence  
results

Uniqueness  
results



# Uniqueness of fuzzy stable models

Case  $L = [0, 1]$  and product t-norm

Fuzzy stable models:  
definition,  
existence,  
uniqueness

Manuel  
Ojeda-Aciego

Introduction

Normal Logic  
Programs

Existence  
results

Uniqueness  
results

## Theorem

Let  $\mathbb{P}$  be a finite normal residuated logic program, and  $p$  a propositional symbol occurring in  $\mathbb{P}$ . If, for every rule  $\langle p \leftarrow q_1 * \dots * q_h * \neg q_{h+1} * \dots * \neg q_k ; \vartheta \rangle \in \mathbb{P}$ , the inequality

$$\left( \sum_j^h \vartheta_{q_1} \cdot \dots \cdot \vartheta_{q_{j-1}} \cdot \vartheta_{q_{j+1}} \cdot \dots \cdot \vartheta_{q_h} \cdot \vartheta \right) + (k-h)(\vartheta_{q_1} \cdot \dots \cdot \vartheta_{q_h} \cdot \vartheta) < 1$$

holds, then there is only one stable model of  $\mathbb{P}$ , where we write  $\vartheta_p = \max\{\vartheta_j : \langle p \leftarrow \mathcal{B} ; \vartheta_j \rangle \in \mathbb{P}\}$



# Uniqueness of fuzzy stable models

Case  $L = [0, 1]$  and product t-norm

Fuzzy stable models:  
definition,  
existence,  
uniqueness

Manuel  
Ojeda-Aciego

Introduction

Normal Logic  
Programs

Existence  
results

Uniqueness  
results

## Proof (Sketch).

- $T_{\mathbb{P}}$  is a contractive map with respect to the norm  $\|\cdot\|_{\infty}$  in a specific subset  $A \subseteq [0, 1]^n$ , for this part we use that each element in  $A$  can be seen as one  $[0, 1]$ -interpretation. Then, by applying Banach's fix-point theorem,  $T_{\mathbb{P}}$  has only one fix-point in  $A$ .
- We show as well that, if  $I \in [0, 1]^n$  is a fix-point of  $T_{\mathbb{P}}$ , then  $I$  necessarily belongs to  $A$ . Therefore  $T_{\mathbb{P}}$  has only one fix-point in  $[0, 1]^n$ .
- Finally, taking into account that:
  - Every stable model of  $\mathbb{P}$  is actually a fix-point of  $T_{\mathbb{P}}$
  - We know that there exists at least one stable model of  $\mathbb{P}$then the unique fix-point of  $T_{\mathbb{P}}$  is its unique stable model.





# Uniqueness of fuzzy stable models

Case  $L = [0, 1]$  and product t-norm

Fuzzy stable models:  
definition,  
existence,  
uniqueness

Manuel  
Ojeda-Aciego

Introduction

Normal Logic  
Programs

Existence  
results

Uniqueness  
results

## Corollary

*Consider a rule  $\langle p \leftarrow q_1 * \dots * q_h * \neg q_1 * \dots * \neg q_k ; \vartheta \rangle$  in a finite normal residuated logic program  $\mathbb{P}$ . If the inequality*

$$h \cdot (\max\{\vartheta_{q_1}, \dots, \vartheta_{q_h}, \vartheta\})^h + k \cdot (\max\{\vartheta_{q_1}, \dots, \vartheta_{q_h}, \vartheta\})^{h+1} < 1$$

*holds then the rule satisfies the inequality required in the statement of the previous theorem.*

## Corollary

*Let  $\mathbb{P}$  be a finite normal residuated logic program. If every rule has a weight strictly less than 1 and at most one propositional symbol appears in the body of each rule, then  $\mathbb{P}$  has only one stable model.*



# Computing the unique stable model of $\mathbb{P}$

Case  $L = [0, 1]$  and product t-norm

Fuzzy stable models:  
definition,  
existence,  
uniqueness

Manuel  
Ojeda-Aciego

Introduction

Normal Logic  
Programs

Existence  
results

Uniqueness  
results

## Theorem

*Under the hypothesis of the theorem, the sequence  $l_0 = I_{\perp}$ ,  $l_{i+1} = T_{\mathbb{P}}(l_i)$  converges to the unique stable model of  $\mathbb{P}$ , although it may require  $\omega$  many steps.*

## Remark

*Banach's fix-point theorem provides a method to compute the unique stable model by computing the limit of the sequence:*

$$l_{i+1} = T_{\mathbb{P}}(l_i)$$

*where the initial  $l_0$  can be any  $[0, 1]$ -interpretation.*



# Conclusions and future work

Fuzzy stable  
models:  
definition,  
existence,  
uniqueness

Manuel  
Ojeda-Aciego

Introduction

Normal Logic  
Programs

Existence  
results

Uniqueness  
results

- A lot of well-know results in real vector analysis can be used in the framework of fuzzy logic programming.
- For future work, we are planning a fuzzy approach to Here-and-There and Equilibrium logics.



# References

Fuzzy stable  
models:  
definition,  
existence,  
uniqueness

Manuel  
Ojeda-Aciego

Introduction

Normal Logic  
Programs

Existence  
results

Uniqueness  
results



Madrid & Ojeda-Aciego. Measuring inconsistency in fuzzy answer set semantics. *IEEE Transactions on Fuzzy Systems*, 19(4):605-622, 2011.



Madrid & Ojeda-Aciego. On the existence and unicity of stable models in normal residuated logic programs. *Intl J of Computer Mathematics*, 89(3):310-324, 2012.



# Advertisements

Forthcoming related workshops in Málaga

Fuzzy stable  
models:  
definition,  
existence,  
uniqueness

Manuel  
Ojeda-Aciego

Introduction

Normal Logic  
Programs

Existence  
results

Uniqueness  
results



**CLA'12 Concept Lattices and Applications**  
Oct 11-14, 2012, Fuengirola (Málaga)

**Website** <http://www.matap.uma.es/c1a2012/>

**Deadline** June 29 (abstracts required on June 22)



Fuzzy stable  
models:  
definition,  
existence,  
uniqueness

Manuel  
Ojeda-Aciego

Introduction

Normal Logic  
Programs

Existence  
results

Uniqueness  
results

# Fuzzy stable models: definition, existence, uniqueness

Nicolás Madrid

*Univ of Cádiz*

Manuel Ojeda-Aciego

*Univ of Málaga*

Olomouc, March 5, 2012