## An invitation to Study Fuzzy and Generalized Uncertainty Optimization

A Historical and Contemporary View

RICARDO COELHO Department of Statistics and Applied Mathematics Federal University of Ceará

WELDON LODWICK Department of Mathematical and Statistical Sciences University of Colorado Denver

## MOTIVATION AND OBJECTIVE

- One of the most significant features of human beings is the decision-making of everyday problems.
- The database of the practical problems, in many cases, have approximate and/or imprecise values.
- The goal of this course is to present a brief description how to use fuzzy set and possibility theories in optimization methods.

# OUTLINE

Fuzzy Mathematical Programming – the beginning

### Parametric Approach – the beginning

### Parametric Approach – the evolution

## WHERE EVERYTHING BEGAN

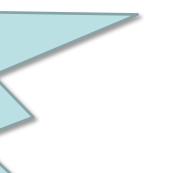
INFORMATION AND CONTROL 8, 338-353 (1965)

#### Fuzzy Sets\*

L. A. ZADEH

Department of Electrical Engineering and Electronics Research Laboratory, University of California, Berkeley, California

A fuzzy set is a class of objects with a continuum of grades of membership. Such a set is characterized by a membership (characteristic) function which assigns to each object a grade of membership ranging between zero and one. The notions of inclusion, union, intersection, complement, relation, convexity, etc., are extended to such sets, and various properties of these notions in the context of fuzzy sets are established. In particular, a separation theorem for convex fuzzy sets is proved without requiring that the fuzzy sets be disjoint.





Lotfi A. Zadeh



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1965

"Fuzzy Sets" Information and Control. 8 (3) 338–353. 1965

Fuzzy sets LA Zadeh - Information and control, 1965 Citado por 65621 - Artigos relacionados - Todas as 29 versões

# FUZZY MATHEMATICAL PROGRAMMING THE BEGINNING

MANAGEMENT SCIENCE Vol. 17, No. 4, December, 1970 Printed in U.S.A.

#### DECISION-MAKING IN A FUZZY ENVIRONMENT\*\*

#### R. E. BELLMAN<sup>‡</sup> AND L. A. ZADEH§

By decision-making in a fuzzy environment is meant a decision process in which the goals and/or the constraints, but not necessarily the system under control, are fuzzy in nature. This means that the goals and/or the constraints constitute classes of alternatives whose boundaries are not sharply defined.

An example of a fuzzy constraint is: "The cost of A should not be substantially higher than  $\alpha$ ," where  $\alpha$  is a specified constant. Similarly, an example of a fuzzy goal is: "z should be in the vicinity of  $x_0$ ," where  $x_0$  is a constant. The italicized words are the sources of fuzziness in these examples.

Fuzzy goals and fuzzy constraints can be defined precisely as fuzzy sets in the space of alternatives. A fuzzy decision, then, may be viewed as an intersection of the given goals and constraints. A maximizing decision is defined as a point in the space of alternatives at which the membership function of a fuzzy decision attains its maximum value.

The use of these concepts is illustrated by examples involving multistage decision processes in which the system under control is either deterministic or stochastic. By using dynamic programming, the determination of a maximizing decision is reduced to the solution of a system of functional equations. A reverse-flow technique is described for the solution of a functional equation arising in connection with a decision process in which the termination time is defined implicitly by the condition that the process stops when the system under control enters a specified set of states in its state space.

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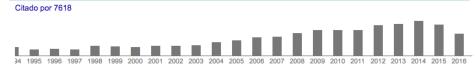
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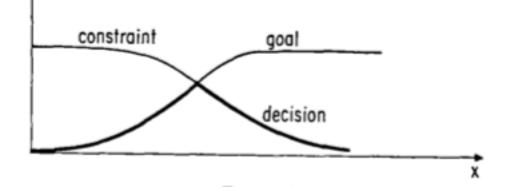
### Richard E. Bellman Lotfi A. Zadeh

"Decision-Making in a Fuzzy Environment" *Management Science*. Vol. 17, No. 4, Application Series (Dec., 1970), pp. B141-B164

Decision-making in a fuzzy environment RE Bellman, LA Zadeh - Management science, 1970 Citado por 7618 - Artigos relacionados - Todas as 14 versões

# DECISION-MAKING IN AN FUZZY ENVIRONMENT

Definition: Assume that we are given a fuzzy goal G and a fuzzy constraint C in a space of alternatives X. Then, G and C combine to form a decision, D, which is a fuzzy set resulting from intersection of G and C.



# DECISION-MAKING IN AN FUZZY ENVIRONMENT

- Suppose that we have n objective functions G<sub>1</sub>, ..., G<sub>n</sub>, and m constraint C<sub>1</sub>, ..., C<sub>m</sub>.
- Then, the resultant decision is the intersection of the given goals, G<sub>1</sub>, ..., G<sub>n</sub>, and the given constraints, C<sub>1</sub>, ..., C<sub>m</sub>. That is,

$$D = G_1 \cap G_2 \cap \cdots \cap G_n \cap C_1 \cap C_2 \cap \cdots \cap C_m$$

and correspondingly

 $\mu_D = \mu_{\sigma_1} \wedge \mu_{\sigma_2} \wedge \cdots \wedge \mu_{\sigma_n} \wedge \mu_{c_1} \wedge \mu_{c_2} \wedge \cdots \wedge \mu_{c_m}$ 

# CHRONOLOGY OF METHODS TO FUZZY MATHEMATICAL PROGRAMMING



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#### On Fuzzy-Mathematical Programming

#### Hideo Tanaka,<sup>†</sup> Tetsaji Okuda, Kiyoji Asai

Department of Electrical Engineering and Computer Sciences and the Electronics Research Laboratory. University of California, Berkeley

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INDEX TERMS 1977, Vol. 6, pp. 197-201

Int. J. General Systems 1976, Vol. 2, pp. 209-215

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#### ON PROGRAMMING WITH FUZZY CONSTRAINT SETS

S. A. ORLOVSKY

Operations Research Laboratory, Computing Center of the Academy of Sciences of the USSR, Vavilova 40, Moscow 117333 (USSR)

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1974

## 1976

### 1977



# FUZZY MATHEMATICAL PROGRAMMING THE BEGINNING

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### On Fuzzy-Mathematical Programming

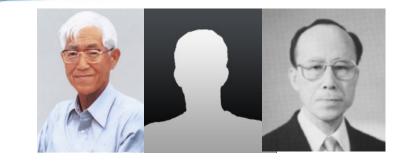
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#### On Fuzzy-Mathematical Programming

www.tandfonline.com/doi/pdf/10.1080/01969727308545912 ▼ Traduzir esta página de H Tanaka† - 1973 - Citado por 582 - Artigos relacionados On Fuzzy-Mathematical Programming. Hideo Tanaka,1 Tetsuji Okuda, Kiyoji Asai . Department of Electrical Engineering and Computer Sciences and the ...



### Hideo Tanaka Tetsuji Okuda Kiyoji Asai

"On Fuzzy Mathematical Programming" Journal of Cybernetics 1974, 3, 4, pp. 37-46

# ON FUZZY-MATHEMATICAL PROGRAMMING

Definition 1: For a in [0,1], an a level set of a constraint
C is denoted by C<sub>a</sub> and is a nonfuzzy set in x defined by

$$C_{\alpha} = \left\{ x | \mu_{C}(x) \ge \alpha \right\}$$

• Proposition 1:  $\sup_{x} \mu_D(x) = \sup_{\alpha} [\alpha \Lambda \max_{C_{\alpha}} \mu_G(x)]$ 

• Proposition 2: 
$$\sup_{\alpha_1 \cdots \alpha_n} \alpha_1 \wedge \cdots \wedge \alpha_n \wedge \max_{C_{\alpha_1} \circ \cdots \circ C_{\alpha_n}} \mu_G(x)$$
  
=  $\sup_{\alpha} \alpha \wedge \max_{C_{\alpha} \circ \cdots \circ C_{\alpha}} \mu_G(x)$ 

# ON FUZZY-MATHEMATICAL PROGRAMMING

- Theorem 1:  $\sup_{\alpha} \left[ \alpha \Lambda \max_{C_{\alpha}} f(x) \right] = \max_{T} f(x)$ where  $T = \left\{ x | f(x) - \mu_{C}(x) = 0 \right\}.$
- Theorem 2:  $\inf_{\alpha} [\alpha V \max_{C_{\alpha}} f(x)] = \sup_{\alpha} [\alpha \Lambda \max_{C_{\alpha}} f(x)]$
- Theorem 3: If max f(x) is a-continuous and f(x) is strongly fuzy convex, then a<sup>\*</sup> is unique.
- Theorem 4: If the membership function of the set of constraints is strongly fuzzy convex, max f(x) is acontinuous.

# FUZZY MATHEMATICAL PROGRAMMING THE BEGINNING

Int. J. General Systems 1976, Vol. 2, pp. 209-215

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#### DESCRIPTION AND OPTIMIZATION OF FUZZY SYSTEMS\*

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The concept of fuzzy sets is presented as a new tool for the formulation and solution of systems and decision problems which contain fuzzy components or fuzzy relationships. After a brief description of the basic theory of fuzzy sets, implications to systems theory and decision making are indicated. Fuzzy set theory is then applied to fuzzy linear programming problems and it is shown how fuzzy linear programming problems can be solved without increasing the computational effort. Some critical remarks concerning the presently existing axioms and necessary future research efforts conclude this introductionary paper.

INDEX TERMS Fuzzy set, fuzzy systems, decision making, fuzzy optimal decisions, fuzzy linear programming, fuzzy solutions,

#### DESCRIPTION AND OPTIMIZATION OF FUZZY SYSTEMS

www.tandfonline.com/doi/pdf/10.1080/03081077608547470 - Traduzir esta página de HJ ZIMMERMANN - 1976 - Citado por 1012 - Artigos relacionados

After a brief **description** of the basic theory of **fuzzy** sets, implications to **systems** theory and decision making are indicated. **Fuzzy** set theory is then applied to.



### Hans J. Zimmermann

"Description and optimization of fuzzy systems" International Journal of General Systems and decision 1976, vol 2, pp. 209-215

# DESCRIPTION AND OPTIMIZATION OF FUZZY SYSTEMS

- Let be a standard linear programming problem with fuzzy order relation;
- By using the conceptions describe in Bellman & Zadeh, the objective function is transformed into a constraint;
- Each constraint has a maximal allowance tolerance and it is transformed into a classical constraint function.

# DESCRIPTION AND OPTIMIZATION OF FUZZY SYSTEMS

- By using the maximal allowance tolerance, we can define a membership function for each constraint;
- After, we can do an intersection of all this membership functions and we define the membership function to set of constraints;
- Finally, we optimize the level cut *a* in order to maximize it.

# FUZZY MATHEMATICAL PROGRAMMING THE BEGINNING

Kybernetes 1977, Vol. 6, pp. 197-201 © Thales Publications (W.O.) Ltd. Printed in Great Britain

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ON PROGRAMMING WITH FUZZY CONSTRAINT SETS: Kybernetes ...

www.emeraldinsight.com/doi/pdf/10.1108/eb005453 - Traduzir esta página de SA ORLOVSKY - 1977 - Citado por 87 - Artigos relacionados

Abstract: Two solution concepts for a FMP problem are suggested. The first one makes use of level sets of the fuzzy set of feasible alternatives. The second ...



### S. A. Orlovsky

"On programming with fuzzy constraint sets" *Kybernetes* 1977, vol 6, pp. 197-201

# **CHRONOLOGY OF METHODS TO FUZZY** MATHEMATICAL PROGRAMMING



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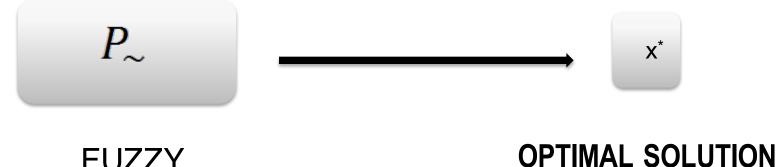
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1965

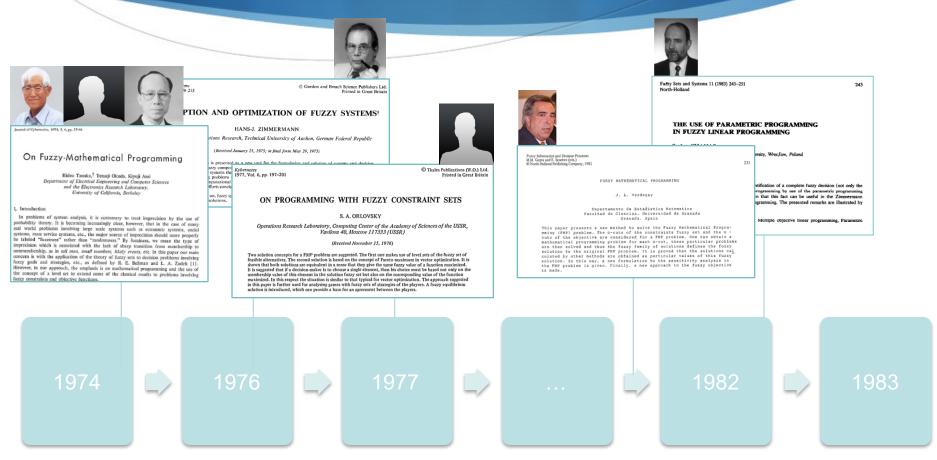
# GOAL TO METHODS TO FUZZY MATHEMATICAL PROGRAMMING



### FUZZY PROBLEM

(classical solution)

# CHRONOLOGY OF METHODS TO FUZZY MATHEMATICAL PROGRAMMING to be continue ...



## FUZZY MATHEMATICAL PROGRAMMING

Fuzzy Sets and Systems 11 (1983) 243-251 North-Holland 243

#### THE USE OF PARAMETRIC PROGRAMMING IN FUZZY LINEAR PROGRAMMING

Stefan CHANAS Institute of Management, Technical University, WrocJaw, Poland

Received February 1982 Revised March 1983

In this paper the possibility of the identification of a complete fuzzy decision (not only the maximizing alternative) in fuzzy linear programming by use of the parametric programming technique is presented. Also, it is shown that this fact can be useful in the Zimmermann approach to multiple objective linear programming. The presented remarks are illustrated by some numerical examples.

Keywords: Puzzy linear programming, Multiple objective linear programming, Parametric programming.

The use of parametric programming in fuzzy linear ... - ScienceDirect www.sciencedirect.com/science/article/pii/S0165011483800839 ▼ Traduzir esta página de S Chanas - 1983 - Citado por 242 - Artigos relacionados 8 de mar de 2005 - In this paper the possibility of the identification of a complete fuzzy decision (not only the maximizing alternative) in fuzzy linear programming by ...



### **Stefan Chanas**

The use of parametric programming in fuzzy linear programming" *Fuzzy Sets and Systems* 11 (1983) 243–251

# FUZZY MATHEMATICAL PROGRAMMING PARAMETRIC APPRAOCH

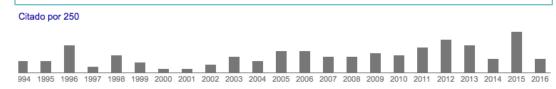
Fuzzy Information and Decision Processes M.M. Gupta and E. Sanchez (eds.) © North-Holland Publishing Company, 1982

FUZZY MATHEMATICAL PROGRAMMING

J. L. Verdegay

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This paper presents a new method to solve the Fuzzy Mathematical Programming (FMP) problem. The  $\alpha$ -cuts of the constraints fuzzy set and the  $\alpha$ -cuts of the objective are considered for a FMP problem. One can obtain a mathematical programming problem for each  $\alpha$ -cut, these particular problems are then solved and thus the fuzzy family of solutions defines the fuzzy solution to the original FMP problem. It is proved that the solutions calculated by other methods are obtained as particular values of this fuzzy solution. In this way, a new formulation to the sensitivity analysis in the FMP problem is given. Finally, a new approach to the fuzzy objective is made.



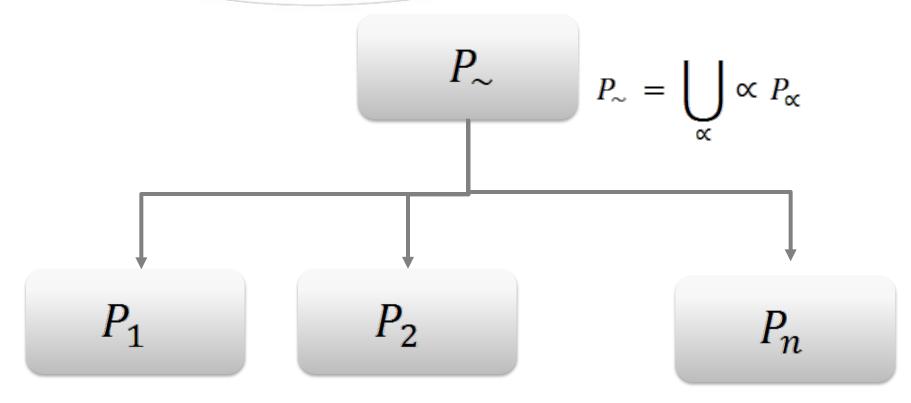
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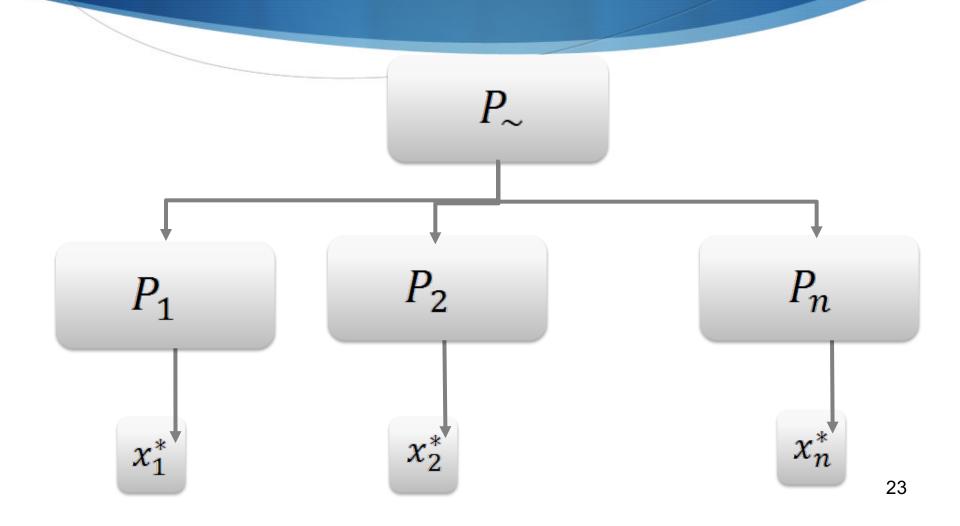
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"Fuzzy Mathematical Programming" Fuzzy Information and Decision Process M.M. Gupta and Sanchez (eds) North-Holland Publishing Company 1982

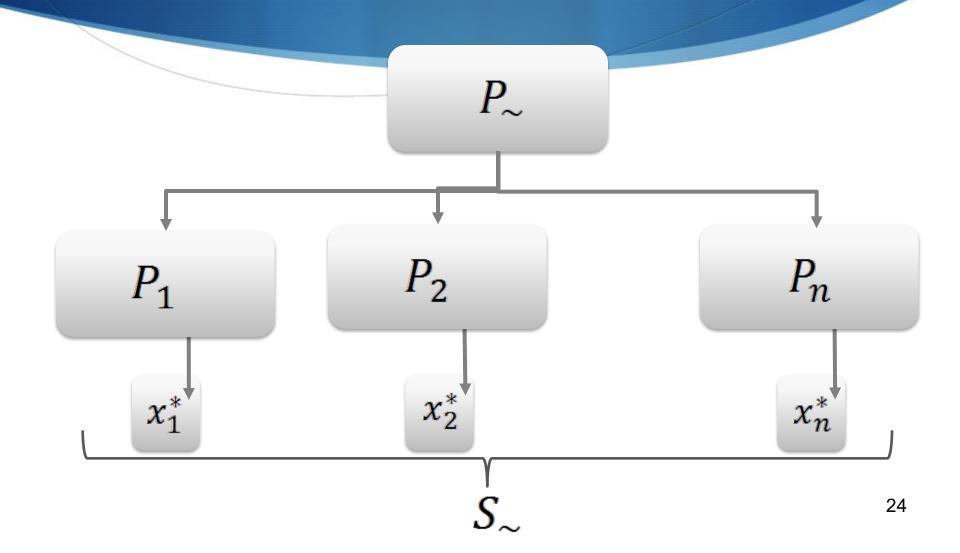
# FUZZY PARAMETRIC APPROACH PHASE 1



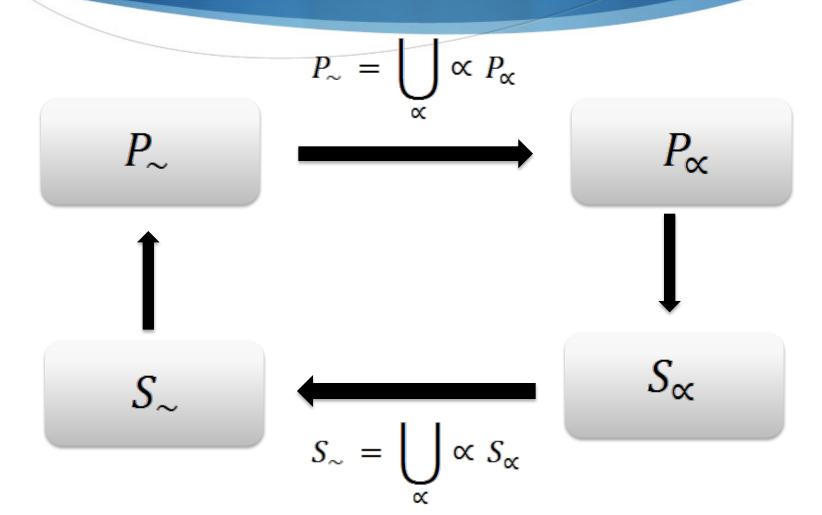
# FUZZY PARAMETRIC APPROACH PHASE 2



## FUZZY PARAMETRIC APPROACH

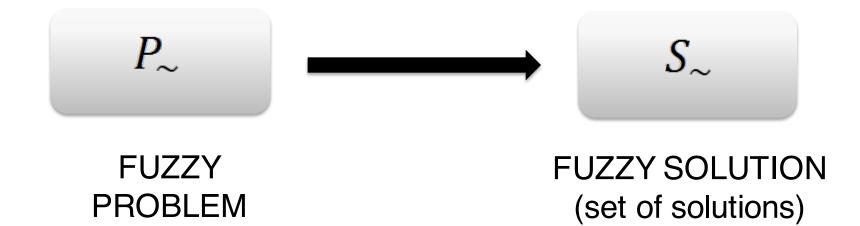


## FUZZY PARAMETRIC APPROACH

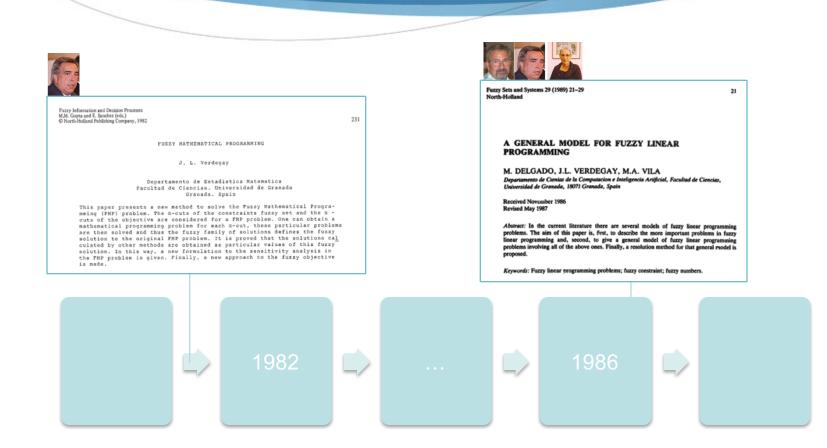


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# GOAL TO OPTIMIZATION METHODS WITH PARAMETRIC APPROACH



# CHRONOLOGY OF METHODS WITH PARAMETRIC APPROACH



## A GENERAL METHOD

Fuzzy Sets and Systems 29 (1989) 21-29 North-Holland

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#### A GENERAL MODEL FOR FUZZY LINEAR PROGRAMMING

M. DELGADO, J.L. VERDEGAY, M.A. VILA

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Received November 1986 Revised May 1987

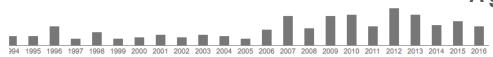
Abstract: In the current literature there are several models of fuzzy linear peogramming problems. The aim of this paper is, first, to describe the more important problems in fuzzy linear programming and, second, to give a general model of fuzzy linear programming problems involving all of the above ones. Finally, a resolution method for that general model is proposed.

Keywords: Fuzzy linear programming problems; fuzzy constraint; fuzzy numbers.



Miguel Delgado
J.L. Verdegay
Amparo Vila

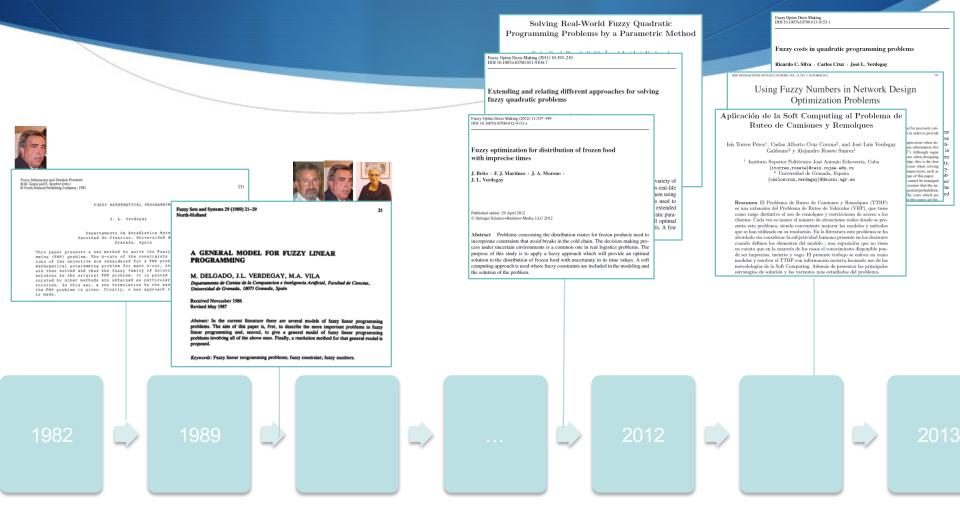
Citado por 335



"A general model for fuzzy linear programming" *Fuzzy Sets and Systems*, 29-1, 10 Janeiro 1989, Páginas 21–29

A general model for fuzzy linear programming M Delgado, JL Verdegay, MA Vila - Fuzzy Sets and systems, 1989 Citado por 335 - Artigos relacionados - Todas as 5 versões

## CHRONOLOGY OF METHODS WITH PARAMETRIC APPROACH



## FUZZY MATHEMATICAL PROGRAMMING



### FUZZY QUADRATIC PROGRAMMING

#### Solving Real-World Fuzzy Quadratic Programming Problems by a Parametric Method

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Abstract. Although fuzzy quadratic programming problems are of the utmost importance in an increasing variety of practical fields, there are remaining technological areas in which has not been tested their applicability or, if tried, have been little studied possibilities. This may be the case of Renewable Energy Assessment, Service Quality, Technology Foresight, Logistics, Systems Biology, etc. With this in mind, the goal of this paper is to apply a parametric approach previously developed by authors to solve some of these problems, specifically the portfolio selection problem by using BM&FBOVESPA data of some Brazilian securities and the economic dispatch problem, which schedules a power generation in an appropriate manner in order to satisfy the load demand.

$\alpha$	Decision Variables	FunObj
0.0	$0.0501 \ 0.2501 \ 0.3751 \ 0.9167 \ 0.3751 \ 0.3001$	477.6953
0.1	0.0530 0.2525 0.3826 0.9217 0.3826 0.3030	484.2223
0.2	$0.0560 \ 0.2550 \ 0.3901 \ 0.9267 \ 0.3901 \ 0.3060$	490.7662
0.3	0.0590 0.2575 0.3975 0.9317 0.3975 0.3090	497.3270
0.4	0.0620 0.2600 0.4050 0.9366 0.4050 0.3120	503.9047
0.5	$0.0650 \ 0.2625 \ 0.4124 \ 0.9416 \ 0.4124 \ 0.3150$	510.4993
0.6	$0.0680 \ 0.2650 \ 0.4199 \ 0.9466 \ 0.4199 \ 0.3180$	517.1108
0.7	0.0709 0.2675 0.4273 0.9516 0.4273 0.3209	523.7392
0.8	$0.0739 \ 0.2699 \ 0.4348 \ 0.9565 \ 0.4348 \ 0.3239$	530.3846
0.9	$0.0769 \ 0.2724 \ 0.4423 \ 0.9615 \ 0.4423 \ 0.3269$	537.0468
1.0	$0.0799 \ 0.2749 \ 0.4497 \ 0.9665 \ 0.4497 \ 0.3299$	543.7259

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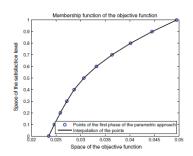
### Extending and relating different approaches for solving fuzzy quadratic problems

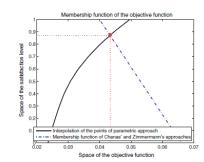
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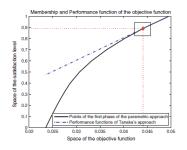
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Abstract Quadratic programming problems are applied in an increasing variety of practical fields. As ambiguity and vagueness are natural and ever-present in real-life situations requiring solutions, it makes perfect sense to attempt to address them using fuzzy quadratic programming problems. This work presents two methods used to solve linear problems with uncertainties in the set of constraints, which are extended in order to solve fuzzy quadratic programming problems. Also, a new quadratic parametric method is proposed and it is shown that this proposal contains all optimal solutions obtained by the extended approaches with their satisfaction levels. A few numerical examples are presented to illustrate the proposed method.

α	x	Solution	Time
0.0	[0.0000;  0.1248;  0.1375;  -0.0000;  0.0906;  0.0626;  0.5845;  -0.0000;  -0.0000]	0.0235	2.8140
0.1	[0.0000; 0.0694; 0.1531; 0.0000; 0.0903; 0.0600; 0.6272; 0.0000; -0.0000]	0.0247	0.2804
0.2	[-0.0000; 0.0139; 0.1687; 0.0000; 0.0901; 0.0574; 0.6699; 0.0000; -0.0000]	0.0259	0.3104
0.3	[0.0000; -0.0000; 0.1755; 0.0035; 0.1002; 0.0269; 0.6939; 0.0000; 0.0000]	0.0272	0.2504
0.4	[0.0000; 0.0000; 0.1626; 0.0306; 0.1169; -0.0000; 0.6900; -0.0000; 0.0000]	0.0287	0.2704
0.5	[0.0000;  0.0000;  0.1312;  0.0730;  0.1560;  -0.0000;  0.6398;  0.0000;  -0.0000]	0.0307	0.2303
0.6	[-0.0000; 0.0000; 0.0998; 0.1154; 0.1951; -0.0000; 0.5896; 0.0000; -0.0000]	0.0332	0.2203
0.7	[-0.0000; 0.0000; 0.0684; 0.1579; 0.2343; 0.0000; 0.5395; -0.0000; 0.0000]	0.0364	0.1502
0.8	[0.0000; -0.0000; 0.0370; 0.2003; 0.2734; 0.0000; 0.4893; 0.0000; -0.0000]	0.0402	0.1602
0.9	[-0.0000; 0.0000; 0.0056; 0.2428; 0.3125; 0.0000; 0.4391; 0.0000; -0.0000]	0.0445	0.3004
1.0	[0.0000; 0.0000; 0.0000; 0.2717; 0.3537; 0.0000; 0.3746; -0.0000; 0.0000]	0.0495	0.1102







*In memorian to the professors Bellman, Tanaka, Asai, and Chanas* 

# Thanks for your attention!

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