AN ANALYTICAL STUDY FOR THE ROLE OF FUZZY LOGIC IN IMPROVING METAHEURISTIC OPTIMIZATION ALGORITHMS

Submitted: 21st November 2018; accepted: 07th December 2018

Sonakshi Vij, Amita Jain, Devendra Tayal, Oscar Castillo

DOI: 10.14313/JAMRIS_4-2018/22

Abstract:

The research applications of fuzzy logic have always been multidisciplinary in nature due to its ability in handling vagueness and imprecision. This paper presents an analytical study in the role of fuzzy logic in the area of metaheuristics using Web of Science (WoS) as the data source. In this case, 178 research papers are extracted from it in the time span of 1989-2016. This paper analyzes various aspects of a research publication in a scientometric manner. The top cited research papers, country wise contribution, topmost organizations, top research areas, top source titles, control terms and WoS categories are analyzed. Also, the top 3 fuzzy evolutionary algorithms are extracted and their top research papers are mentioned along with their topmost research domain. Since neuro fuzzy logic poses feasible options for solving numerous research problems, hence a section is also included by the authors to present an analytical study regarding research in it. Overall, this study helps in evaluating the recent research patterns in the field of fuzzy metaheuristics along with envisioning the future trends for the same. While on one hand this helps in providing a new path to the researchers who are beginners in this field as they can start exploring it through the analysis mentioned here, on the other hand it provides an insight to professional researchers too who can dig a little deeper in this field using knowledge from this study.

Keywords: Fuzzy Logic, Metaheuristics, Evolutionary Computing, Genetic Algorithm, Particle Swarm Optimization, Ant Colony Optimization, Fuzzy Evolutionary Algorithms, Fuzzy Cuckoo, Fuzzy Simulated Annealing, Fuzzy Swarm Intelligence, Fuzzy Differential Evolution, Tabu, Fuzzy Mutation, Fuzzy Natural Selection, Fuzzy Fitness Function, Big Bang Big Crunch, Fuzzy Bacterial, Neuro Fuzzy Logic

1. Introduction

While dealing with mathematical and computer science application based optimizations, metaheuristics are considered to be among the best computing solutions [1]. Evolutionary computing is a subset of metaheuristics that are motivated by the concept of biological evolution. Instances include genetic algorithm, differential evolution and genetic programming. Swarm intelligence includes methods like, particle swarm optimization, artificial bee colony algorithm etc. Genetic algorithm is one of the most popular metaheuristic algorithms that is based on the notions of "natural selection" [2]. It follows the concept of the "survival of the fittest" and utilizes a fitness function for optimization. It finds its applications in various domains ranging from control engineering to natural language processing.

Another category of metaheuristic algorithms is particle swarm optimization (PSO) which uses an iterative method of evaluation for optimization [3]. A particular population of candidate solutions is moved in the search space till an optimum solution is achieved. Various other algorithms also exist that help in optimization using nature inspired computing such as the artificial bee colony (ABC) algorithm which replicates the behavior of the "honey bee swarm" for practical engineering applications [4].

Fuzzy logic has also been closely associated to optimization, mainly because of its ability to handle uncertainty, vagueness and imprecision. Due to this it is applied in amalgamation with existing metaheuristic algorithms to give better results. This gives rise to the fuzzy genetic algorithm, fuzzy particle swarm optimization and fuzzy artificial bee colony algorithm. These algorithms have been applied on various applications mainly in the field of computer science. Fuzzy evolutionary computing also provides a way to implement real life natural language processing applications like text summarization. Hence one can say that fuzzy logic and metaheuristics go hand in hand.

In this paper, an analytical study has been performed to highlight the role of fuzzy logic in metaheuristics, evolutionary computing and neuro fuzzy logic. The source of research papers is taken to be Web of Science (WoS). 178 research papers are extracted from it from the time span 1989-2016 [5-182]. The top cited research papers, top research areas, top WoS core categories, fuzzy evolutionary based algorithms, topmost organizations, country wise contribution, top source titles and various control terms are analyzed. The control terms help in identifying the most commonly discussed research concepts in this field. The top 3 fuzzy evolutionary algorithms obtained are highlighted along with their top research papers and topmost research domain. This study helps in evaluating the recent research patterns in the field of fuzzy metaheuristics and fuzzy evolutionary computing. Also, it assists in predicting the future trends that might occur. The rest of the paper is organized as follows: Section 2 describes the data and methodology; Section 3 highlights the results of the study with corresponding visualizations; Section 4 concludes the work.

2. Data and Methodology

The data for this study is collected using Web of Science as the data source, which is a huge database of research papers indexed in Science Citation Index-Expanded (SCI-E), SSCIA&HCI and ESCI. A total of 178 research papers are extracted for the concerned search query [5-182]. The details of the data collected are shown in Table 1.

3. Analytical Study

Table 1. Details of the collected data

The research patterns using WoS as the data source during the time span of 1989-2016, in the field of fuzzy metaheuristics and fuzzy evolutionary computing are evaluated in the following sub-sections.

3.1. Top Cited Research Papers

The top 5 research papers in the field of fuzzy metaheuristics and fuzzy evolutionary computing are evaluated for their respective citation and average citation score per year. The details for the same are shown as in Figure 1. Any researcher who is new to this field can have a look at this study and can start exploring with the help of these top cited research papers.

3.2. Research Areas

Fuzzy logic has found its application for optimization in various disciplines and research areas ranging from computer science to energy fuels. The record count for the top 10 research areas are recorded as shown in Table 2 and can be visualized as illustrated in Figure 2.

3.3. WoS Core Categories

WoS defines various research categories that can be used to define the domain of the various research papers. These categories and the record count of their respective research papers are tabulated as presented in Table 3. The radar chart for the same is shown as illustrated in Figure 3.

Source of research papers	Query entered	Time Span	Total number of research papers	Indexing
WOS (web of science)	TI=("fuzzy metaheuristics" OR "fuzzy bat" OR "fuzzy genetic" OR "fuzzy PSO" OR "fuzzy particle swarm optimization" OR "fuzzy ACO" OR "fuzzy ant colony optimization" OR "fuzzy ant colony" OR "fuzzy evolutionary" OR "fuzzy cuckoo" OR "fuzzy simulated annealing" OR "fuzzy swarm intelligence" OR "fuzzy differential evolution" OR "fuzzy tabu" OR "fuzzy memetic" OR "fuzzy ABC" OR "fuzzy artificial bee colony" OR "fuzzy harmony" OR "fuzzy mutation" OR "fuzzy natural selection" OR "fuzzy fitness function" OR "fuzzy big bang big crunch" or "fuzzy bacterial")	1989-2016	178 [5-182]	Science Citation Index- Expanded (SCI-E), SSCIA&HCI and ESCI.

CITATION

AVERAGE CITATION PER YEAR

A hybrid least square-fuzzy bacterial foraging strategy for harmonic estimation

A fuzzy-genetic approach to breast cancer diagnosis

Fuzzy genetic algorithm for optimization of steel structures

Fuzzy-genetic approach to aggregate production-distribution planning in supply chain management

FuGeNeSys - A fuzzy genetic neural system for fuzzy modeling

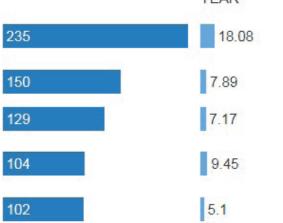


Fig. 1. Citation and average citation per year of the top 5 research papers

Table 2. Record count for top 10 research areas

S.NO.	RESEARCH AREAS	RECORD COUNT
1	Computer Science	99
2	Engineering	96
3	Operations Research Management Science	20
4	Mathematics	16
5	Automation Control Systems	15
6	Water Resources	8
7	Energy Fuels	5
8	Telecommunications	5
9	Mechanics	4
10	Science Technology Other Topics	4

Table 3. Record count for top 10 WoS core categories

S.NO.	WOS CATEGORIES	RECORD COUNT
1	Computer Science Artificial Intelligence	63
2	Engineering Electrical Electronic	47
3	Computer Science Interdisciplinary Applications	22
4	Operations Research Management Science	20
5	Engineering Multidisciplinary	18
6	Computer Science Theory Methods	16
7	Automation Control Systems	15
8	Computer Science Information Systems	15
9	Engineering Civil	13
10	Mathematics Applied	9

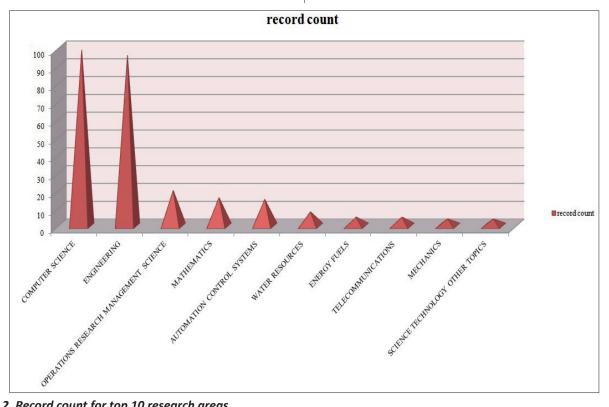


Fig. 2. Record count for top 10 research areas

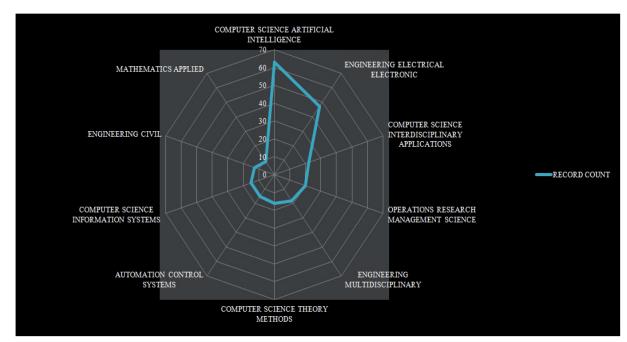


Fig. 3. Radar chart for record count of top 10 WoS core categories

3.4. Fuzzy Evolutionary Algorithm Based Analysis

The popularity of various fuzzy evolutionary algorithms among researchers was analyzed using their record count. The top 3 fuzzy evolutionary algorithms were found to be fuzzy genetic, fuzzy PSO and fuzzy ACO. Their corresponding topmost research areas were extracted so as to analyze in which domains they are being currently applied. The top cited research paper for each fuzzy evolutionary algorithm is also mentioned for reference of the researchers. All these credentials are recorded as shown in Table 4 and visualized in the form of a cluster dendrogram as illustrated in Figure 4.

Table 4. Record analysis of various fuzzy evolutionary algorithms

S.NO.	FUZZY EVOLUTIONARY ALGORITHMS	QUERY	RECORD COUNT	TOP CITED PAPER	TOP RESEARCH AREA
1	Fuzzy Genetic Algorithm	TI= ("fuzzy genetic" OR "fuzzy mutation" OR "fuzzy natural selection" OR "fuzzy fitness function")	114	A fuzzy- genetic approach to breast cancer diagnosis	Engineering
2	Fuzzy PSO	TI= ("fuzzy PSO" OR "fuzzy particle swarm optimization" OR "fuzzy swarm intelligence")	25	Scheduling jobs on computational grids using a fuzzy particle swarm optimization algorithm	Computer Science
3	Fuzzy ACO	TI= ("fuzzy ACO" OR "fuzzy ant colony optimization" OR "fuzzy ant colony")	10	Developing a diagnostic system through integration of fuzzy case-based reasoning and fuzzy ant colony system	Computer Science



Fig. 4. Cluster Dendrogram for fuzzy evolutionary algorithms record details

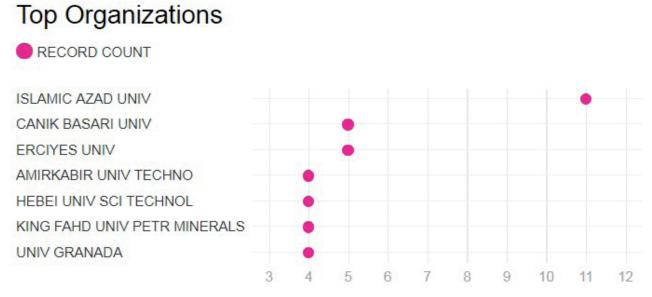


Fig. 5. Scatter plot graph for the top organizations

The cluster dendrogram shown in Figure 4 is a representation of the data summarized in Table 4. The attributes of the cluster dendrogram are all inter related and they are seen as a way of performing hierarchical clustering. The three aspects of this cluster dendrogram illustrated in Figure 4 show that:

- a) PSO (fuzzy) has 25 research publications associated with it and the corresponding research area that the papers belong the most is computer science.
- b) Genetic algorithm (fuzzy) has 114 research publications associated with it and the corresponding research area that the papers belong the most is engineering.
- c) ACO (fuzzy) has 10 research publications associated with it and the corresponding research area that the papers belong the most is computer science.

3.5. Top Organizations

The top organizations that have made significant contributions in terms of research papers in the field of fuzzy metaheuristics and fuzzy evolutionary computing are analyzed. These are listed as indicated in Table 5. The credentials are visualized in the form of a scatter plot graph as highlighted in Figure 5. Organizations working in this field may take motivation from the top contributing research organizations to promote research and provide more resources to increase their research contribution, giving rise to a healthy and constructive research competition in this area.

3.6. Countrywise Contribution

The country wise contribution in terms of research paper publications can be seen in terms of record count in WoS. The summary for the same are recorded as in Table 6.

Table 5. Top organizations in terms of research papers

S.NO.	ORGANIZATION NAME	RECORD COUNT
1	ISLAMIC AZAD UNIV	11
2	CANIK BASARI UNIV	5
3	ERCIYES UNIV	5
4	AMIRKABIR UNIV TECHNO	4
5	HEBEI UNIV SCI TECHNOL	4
6	KING FAHD UNIV PETR MINERALS	4
7	UNIV GRANADA	4

Table 6	5.	Country	wise	record	count
---------	----	---------	------	--------	-------

S.NO.	COUNTRY	RECORD COUNT
1	IRAN	28
2	PEOPLES R CHINA	26
3	INDIA	24
4	TURKEY	17
5	TAIWAN	14
6	USA	13
7	ENGLAND	11
8	MALAYSIA	7
9	SPAIN	7
10	SAUDI ARABIA	5

The topmost countries according to research paper publication count, as listed above are mapped (highlighted in purple color) as illustrated in Figure 6. The country wise contribution can change with time as upcoming publications are lined up for the year 2017.

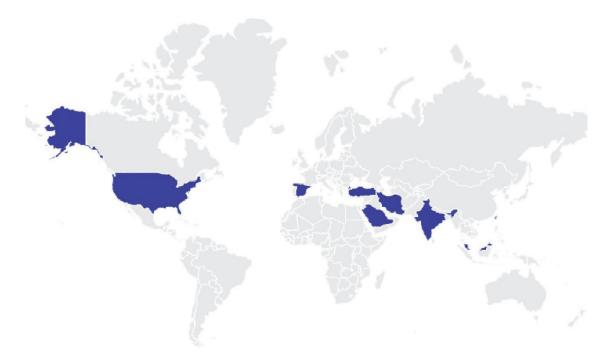


Fig. 6. Mapping the top countries

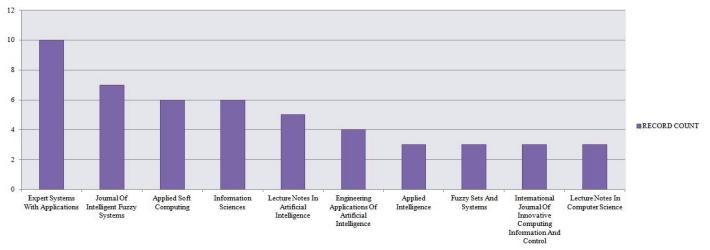


Fig. 7. Area graph for the top source titles

3.7. Top Source Titles

The topmost journals publishing research work in the area of fuzzy metaheuristics and fuzzy evolutionary algorithms were extracted. The data for the same is visualized as shown in Figure 7. It can be observed that expert system with applications has been associated with the maximum record count in this field, followed by the journal of intelligent fuzzy systems and applied soft computing.

3.8. Analysis of the Control Terms

Control terms are the ones that help in determining the most commonly studied concepts in a particular field and therefore are the ones that are the most frequently mentioned in the corresponding research papers. In this study, several control terms are identified manually (using VOSviewer) in the field of fuzzy metaheuristics and fuzzy evolutionary computing. These control terms are shown as in figure 8, in the form of cluster density visualization.

The terms in the same cluster are shown in the same color. The fact that these terms lie in the same cluster show that these terms have a higher probability of occurring in the same research paper. The density plot of these control terms is as shown in Figure 9. The research community can benefit from these control terms in the sense that if they want to study fuzzy metaheuristics or fuzzy evolutionary computing then they can begin by studying these concepts first.

Figure 10 shows the keyword co-occurrence network visualization for the identified control terms. These are the top ranked keywords according to the frequency of occurrence. The larger is the size of the bubbles in this bubble plot, greater is its significance in the given context.

	chromosome		
test cas			
fpso	/ergence informat		
pso effectiveness co	ost rule _{fga}	artificial neural network	mae fg model
fuzzy particle swarm optim particle swarm optim		fuzzy genetic approach anfis	
_{flc} objective fur	nction fuzzy mod		
robustness control			
K VOSviewer			

Fig. 8. Cluster density visualization for the control terms

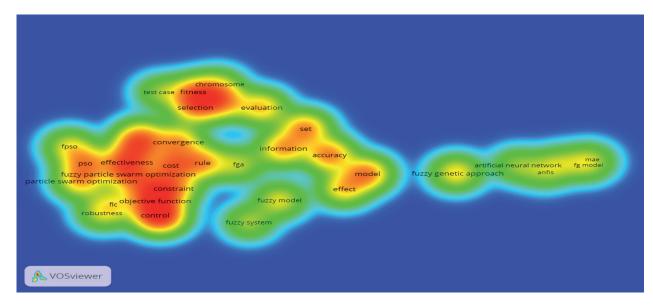


Fig. 9. Density plot for control terms

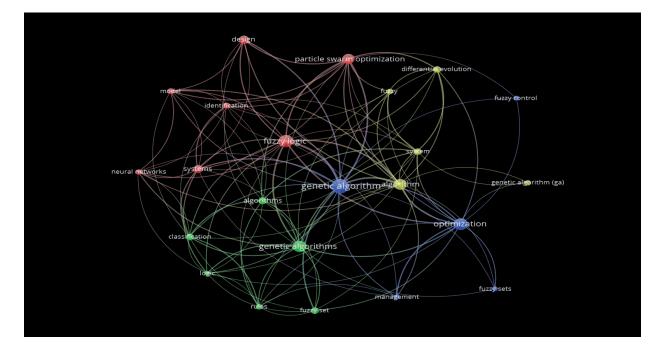


Fig. 10. Keyword co-occurrence network visualization

403 Engineering	83 ENERGY FUELS	50 48 ENVIRONMENTAL SCIENCES ECOLOGY SYSTEMS		ION CONTROL IN		45 nstruments nstrumentation	
283	68 SCIENCE TECHNOLOGY OTHER TOPICS	37 geology		29 agriculture		29 CHEMISTRY	
COMPUTER SCIENCE	68 WATER RESOURCES	34 MATERIALS SCIENCE 33 THERMODYNAMICS		29 operations research management science		25 mathematics	

Fig. 11. Tree Map for top 15 WoS categories of research areas for neuro fuzzy research publications

3.9. Neuro Fuzzy Logic

It is worth mentioning that neuro fuzzy logic plays an integral role in the research related to the domain of fuzzy metaheuristics. In the web of science, the total record count for research publications catering to neuro fuzzy logic is 2568. If the past 5 years data from web of science is to be analyzed then one can notice that a total of 918 papers are extracted in this field. This proves the progress in research in neuro fuzzy logic. These 918 papers are cited to a total of 4461 times, which is huge. Figure 11 has been taken as a screenshot from Web of Science for depicting the tree Map for top 15 categories of research areas for neuro fuzzy research publications. This data was visualized for research papers in this field in the last 5 years i.e. 2013-2018. It could be well observed that neuro fuzzy finds application in areas ranging from computer science to energy fuels.

The top 5 research domains catering to neuro fuzzy research are:

- i. Engineering
- ii. Computer science
- iii. Energy fuels
- iv. Science technology and other topics, Water resources
- v. Environmental science ecology

The top 5 research publications in this field, ranked according to the times they are cited are as follows:

- a) Neuro-fuzzy modeling and control, with a citation score of 1105
- b) Neuro-fuzzy rule generation: Survey in soft computing framework, with a citation score of 415
- c) A neuro-fuzzy computing technique for modeling hydrological time series, with a citation score of 321
- d) Adaptive neuro-fuzzy inference system for prediction of water level in reservoir, with a citation score of 260

e) A comparative study on the predictive ability of the decision tree, support vector machine and neuro-fuzzy models in landslide susceptibility mapping using GIS, with a citation score of 258

The number of research papers for fuzzy metaheuristics, evolutionary computing and neuro fuzzy logic is expected to further grow in the coming years which would open new doors of research for scientists and academicians across the globe.

4. Conclusion

This paper presents an analytical study in the field of fuzzy metaheuristics and fuzzy evolutionary computing. The study is performed on 178 research papers extracted from the Web of Science, in the time span of 1989-2016. The top cited research papers, country wise contribution, top source titles, topmost organizations, control terms, top research areas and WoS core categories are analyzed. Also, the top 3 fuzzy evolutionary algorithms are obtained and their top research papers are highlighted along with their topmost research domain. This type of an analytical study is expected to assist the researchers working in this domain in exploring the discipline.

Researchers can study in depth the practical applications of these algorithms and then apply it according to its relevance in their corresponding research domains. Any researcher who is new to this field can also have a look at this study and start exploring with the help of the top cited research papers that are mentioned here. The country wise contribution can change with time as upcoming publications are lined up for the year 2017 and 2018. Other organizations working in this field may take motivation from the top contributing research organizations mentioned here to promote research and provide more resources to increase their research contribution, giving rise to a healthy and constructive research competition.

Various control terms that are identified during this study, will help in guiding the researchers to explore the individual research topics in detail. The top 3 fuzzy evolutionary algorithms are identified which shall assist the research community in exploring their counterparts as well so that research is done in varied fields. A section presents analytical study regarding research in neuro fuzzy as well since it poses feasible options for solving numerous research problems. As a part of the future work, this study can be performed using other databases as well.

Acknowledgments

We thank the Division of Graduate Studies and Research of Tijuana Institute of Technology and the financial support provided by CONACYT contract grant 122.

AUTHORS

Sonakshi Vij – Department of Computer Science Engineering, Indira Gandhi Delhi Technical University for Women, Delhi, India, 110006, sonakshi.vij92@gmail.com.

Amita Jain – Department of Computer Science Engineering, Ambedkar Institute of advanced communica-

neering, Ambedkar Institute of advanced communication technologies and research, Delhi, India, 110031, amita_jain_17@yahoo.com.

Devendra Tayal – Department of Computer Science Engineering, Indira Gandhi Delhi Technical University for Women, Delhi, India, 110006, dev_tayal2001@yahoo.com.

Oscar Castillo* – Division of Graduate Studies and Research, Tijuana Institute of Technology, Mexico, ocastillo@tectijuana.mx.

*Corresponding author

REFERENCES

- K.L. Du, M.N.S. Swamy, Search and optimization by metaheuristics: techniques and algorithms inspired by nature, Birkhäuser Basel, 2016, DOI: 10.1007/978-3-319-41192-7.
- [2] M. Gen, R. Cheng, *Genetic algorithms and engineering optimization*, Wiley-Interscience, 1999.
- [3] M. Clerc, *Particle swarm optimization*, John Wiley & Sons, 2006.
- [4] W. Gao, S. Liu, Improved artificial bee colony algorithm for global optimization, *Information Processing Letters*, vol. 111, no. 17, 2011, 871-882,

DOI: 10.1016/j.ipl.2011.06.002.

[5] R.J. Kuo, B.S. Wibowo, F.E. Zulvia, Application of a fuzzy ant colony system to solve the dynamic

vehicle routing problem with uncertain service time, *Applied Mathematical Modelling*, vol. 40, no. 23-24, 2016, 9990-10001, POL 10101 (*i*, sum 2016 06 025

DOI: 10.1016/j.apm. 2016.06.025.

[6] I. Bekkouche, H. Fizazi, A New Image Clustering Method Based on the Fuzzy Harmony Search Algorithm and Fourier Transform, *Journal Of Information Processing Systems*, vol. 12, no. 4, 2016, 555-576, Pol. 40, 20145.

DOI:10.3745/JIPS.02.0047.

- [7] C. Peraza, F. Valdez, M. Garcia, P. Melin, O. Castillo, A New Fuzzy Harmony Search Algorithm Using Fuzzy Logic for Dynamic Parameter Adaptation, *Algorithms*, vol. 9, no. 4, 2016, DOI: 10.3390/a9040069.
- [8] G. Fargione, D. Tringali, G. Risitano, A fuzzy-genetic control system in the ABS for the control of semi-active vehicle suspensions, *Mechatronics*, vol. 39, no. 89, 2016, DOI: 10.1016 /i mechatronics 2016 08.004.

DOI: 10.1016 /j.mechatronics.2016.08.004.

[9] H. Abounaser, I. Talkhan, A. Fahmy, A Parallel Fuzzy-Genetic Algorithm for Classification and Prediction, *International Journal Of Advanced Computer Science and Applications*, vol. 7, no. 10, 2016,

DOI: 10.14569/IJACSA.2016.071022.

[10] R. Abbasi-ghalehtaki, H. Khotanlou, M. Esmaeilpour, Fuzzy evolutionary cellular learning automata model for text summarization, *Swarm and Evolutionary Computation*, vol. 30, no. 11, 2016, 11-26, DOI: 10.1016/firmerer. 2016.02.004

DOI: 10.1016/j.swevo.2016.03.004.

[11] M.A. Mohiuddin, S.A. Khan, A.P. Engelbrecht, Fuzzy particle swarm optimization algorithms for the open shortest path first weight setting problem, *Applied Intelligence*, vol. 45, no. 3, 2016, 598-621, DOI: 10.0021/1002016.02226.0

DOI: 10.1007/s10489-016-0776-0.

- [12] V. Chandrasekar, M. Mahalakshmi, End to end delay improvement in heterogeneous multicast network using fuzzy genetic approach, The *IIOAB Journal*, vol. 7, no. 9, 2016, 535-541.
- [13] A.T. Abbas, M. Aly, K. Hamza, Multiobjective Optimization Under Uncertainty in Advanced Abrasive Machining Processes Via a Fuzzy-Evolutionary Approach, *Journal Of Manufacturing Science And Engineering*, vol. 138, no. 7, 2016, DOI: 10.1115/1.4032567.
- [14] H.B. Tolabi, R. Hosseini, M.R. Shakarami, A robust hybrid fuzzy-simulated annealing-intelligent water drops approach for tuning a distribution static compensator nonlinear controller in a distribution system, *Engineering Optimization*, vol. 48, no. 6, 2015, 999-1018, DOI: 10.1080/0305215X.2015.1080579
- [15] K. Pandiarajan, C.K. Babulal, Fuzzy harmony search algorithm based optimal power flow for power system security enhancement, *International Journal Of Electrical Power & Energy Systems*, vol. 78, 2016, 72-79, DOI: 10.1016/ j.ijepes.2015.11.053.

 [16] E. Amiri, S. Mahmoudi, Efficient protocol for data clustering by fuzzy Cuckoo Optimization Algorithm, *Applied Soft Computing*, vol. 41, 2016, 15-21,
 DOI: 10.1016 /i assoc.2015.12.008

DOI: 10.1016/j.asoc.2015.12.008.

- [17] L. Su, Y. Qi, L.-L. Jin, LL, Integrated batch planning optimization based on fuzzy genetic and constraint satisfaction for steel production, *International Journal of Simulation Modelling*, vol. 15, no. 1, 2016, 133-143, DOI: 10.2507/ IJSIMM15(1)CO1
- [18] M. Ayati, M. Pasha-Zanousi, Fuzzy PSO-based algorithm for controlling base station movements in a wireless sensor network, *Turkish Journal Of Electrical Engineering And Computer Sciences*, vol. 24, no. 6, 2016, 5068-5077, DOI: 10.3906/elk-1411-118.
- [19] M.-Y. Chou, W.-H. Lee, C.-H. Wang, C.-T. Pang, On the fuzzy genetic algorithm, *Journal Of Nonlinear And Convex Analysis*, vol. 17, no. 5, 2016, 921-929.
- [20] K. Pandiarajan, C.K. Babulal, Static security enhancement using fuzzy particle swarm optimization, COMPEL: The International Journal For Computation And Mathematics In Electrical And Electronic Engineering, vol. 35, no. 1, 2016, 172-186,

DOI: 10.1108/COMPEL-12-2014-0334.

[21] S.H. Ling, K.Y. Chan, KY, F.H.F. Leung, F. Jiang, H. Nguyen, Quality and robustness improvement for real world industrial systems using a fuzzy particle swarm optimization, *Engineering Applications of Artificial Intelligence*, vol. 47, 2016, 68-80,

DOI: 10.1016/j.engappai.2015. 03.003

- [22] C.-J. Lin, C.-F. Wu, H.-Y. Lin, C.-Y. Yu, An Interactively Recurrent Functional Neural Fuzzy Network with Fuzzy Differential Evolution and Its Applications, *Sains Malaysiana*, vol. 44, no. 12, 2015, 1721-1728.
- [23] K. Aydin, O. Kisi, Applicability of a Fuzzy Genetic System for Crack Diagnosis in Timoshenko Beams, *Journal Of Computing In Civil Engineering*, vol. 29, no. 5, 2015, DOI: 10.1061/(ASCE)CP.1943-5487.0000385.
- [24] A.S. El-Wakeel, A.C. Smith, Hybrid Fuzzy-particle Swarm Optimization-simplex (F-PSO-S) Algorithm for Optimum Design of PM Drive Couplings, *Electric Power Components And Systems*, vol. 43, no. 13, 2015, 1560-1571, DOI: 10.1080/15325008.2015.1042598.
- [25] M. Yassami, P. Ashtari, Using fuzzy genetic, Artificial Bee Colony (ABC) and simple genetic algorithm for the stiffness optimization of steel frames with semi-rigid connections, *KSCE Journal of Civil Engineering*, vol. 19, no. 5, 2015, 1366-1374,

DOI: 10.1007/s12205-014-0517-z.

[26] M. Kumar, A. Sharma, R. Kumar, An empirical evaluation of a three-tier conduit framework for multifaceted test case classification and selection using fuzzy-ant colony optimisation approach, *Software: Practice and Experience*, vol. 45, no. 7, 2015, 949-971, DOI: 10.1002/spe.2263.

- [27] M. Alamaniotis, T. Jevremovic, Hybrid Fuzzy-Genetic Approach Integrating Peak Identification and Spectrum Fitting for Complex Gamma-Ray Spectra Analysis, *IEEE Transactions on Nuclear Science*, vol. 62, no. 3, 2015, 1262-1277, DOI: 10.1109/TNS.2015. 2432098.
- [28] M. Malarvizhi, I. Gnanambal, Harmonics elimination in multilevel inverter with unequal DC sources by fuzzy-ABC algorithm, *Journal of Experimental & Theoretical Artificial Intelligence*, vol. 27, no. 3, 2015, 273-292, DOI: 10.1080/0952813X.2014.930596.
- [29] N.F. Omran, S.F. Abd-el Ghany, Applying Topology-Shape-Metric and FUZZY Genetic Algorithm for Automatic Planar Hierarchical and Orthogonal Graphs, *International Journal Of Advanced Computer Science And Applications*, vol. 6, no. 5, 2015, 81-87.
- [30] R. Teimouri, H. Baseri, Forward and backward predictions of the friction stir welding parameters using fuzzy-artificial bee colony-imperialist competitive algorithm systems, *Journal of Intelligent Manufacturing*, vol. 26, no. 2, 2015, 307-319,

DOI: 10.1007/s10845-013-0784-4.

- [31] C.J. Carmona, V. Ruiz-Rodado, M.J. del Jesus, A. Weber, M. Grootveld, P. Gonzalez, D. Elizondo, A fuzzy genetic programming-based algorithm for subgroup discovery and the application to one problem of pathogenesis of acute sore throat conditions in humans, *Information Sciences*, vol. 298, 2015, 180-197, DOI: 10.1016/j.ins.2014.11.030.
- [32] P.K. Jena, D.N. Thatoi, D.R. Parhi, Dynamically Self-Adaptive Fuzzy PSO Technique for Smart Diagnosis of Transverse Crack, *Applied Artificial Intelligence*, vol. 29, no. 3, 2015, 211-232, DOI: 10.1080/08839514.2015.1004611
- [33] M. Yassami, P. Ashtari, Using fuzzy genetic algorithm for the weight optimization of steel frames with semi-rigid connections, *International Journal Of Steel Structures*, vol. 15, no. 1, 2015, 63-73,

DOI: 10.1007/s13296-014-1105-2.

- [34] K.K. Anisha, M. Wilscy, Impulse noise removal from colour images using fuzzy genetic algorithm, *International Journal Of Signal And Imaging Systems Engineering*, vol. 8, no. 4, 2015, DOI: 10.1504/IJSISE.2015.070545
- [35] H. Lian, H, Y. Qin, A new fuzzy particle swarm optimization based on population diversity, *Journal Of Intelligent & Fuzzy Systems*, vol. 29, no. 1, 2015, 135-147, DOI: 10.3233/IFS-151577.
- [36] S.M. Odeh, A.M. Mora, M.N. Moreno, J.J. Merelo, A Hybrid Fuzzy Genetic Algorithm for an Adaptive Traffic Signal System, *Advances in Fuzzy Systems*, 2015, DOI: 10.1155/2015 /378156.

- [37] J. Yang, R. Zhang, Q. Sun, H. Zhang, Optimal Wind Turbines Micrositing in Onshore Wind Farms Using Fuzzy Genetic Algorithm, *Mathematical Problems in Engineering*, 2015, DOI: 10.1155/2015/324203.
- [38] H.B. Tolabi, M.H. Ali, M. Rizwan, Simultaneous Reconfiguration, Optimal Placement of DSTAT-COM, and Photovoltaic Array in a Distribution System Based on Fuzzy-ACO Approach, *IEEE Transactions On Sustainable Energy*, vol. 6, no. 1, 2015, 210-218, DOI: 10.1109/TSTE.2014.2364230.
- [39] X. Li, R. Zuo, The numerical research on improved fuzzy particle swarm optimization, *Journal of Investigative Medicine*, vol. 62, no. 8 (supplement), 2014.
- [40] W. Khaksar, T.S. Hong, M. Khaksar, O. Motlagh, A fuzzy-tabu real time controller for sampling-based motion planning in unknown environment, *Applied Intelligence*, vol. 41, no. 3, 2014, 870-886,

DOI: 10.1007/s10489-014-0572-7.

- [41] A. Khan, J. Ullah, M.A. Jaffar, T.S. Choi, Color image segmentation: a novel spatial fuzzy genetic algorithm, *Signal, Image And Video Processing*, vol. 8, no. 7, 2104, 1233-1243, DOI: 10.1007/s11760-012-0347-8.
- [42] R. Chai, S.H. Ling, G.P. Hunter, Y. Tran, H.T. Nguyen, Brain-Computer Interface Classifier for Wheelchair Commands Using Neural Network With Fuzzy Particle Swarm Optimization, *IEEE Journal of Biomedical and Health Informatics*, vol. 18, no. 5, 2014, 1614-1624, DOI: 10.1109/JBHI.2013.2295006
- [43] Z. Liu, C.Y. Mao, J. Luo, Y. Zhang, C.L.P. Chen, A three-domain fuzzy wavelet network filter using fuzzy PSO for robotic assisted minimally invasive surgery, *Knowledge-Based Systems*, vol. 66, 2014, 13-27, DOI: 10.1016/cilma.com 2014.02.025

DOI: 10.1016/ j.knosys.2014.03.025.

[44] M. Vadood, Predicting the color index of acrylic fiber using fuzzy-genetic approach, *Journal of the Textile Institute*, vol. 105, no. 7, 2014, 779-788,

DOI: 10.1080/00405000.2013.849844

- [45] B. Bhattacharyya, V.K. Gupta, Fuzzy Genetic Algorithm Approach for the Optimal Placement of Flexible AC Transmission Systems Devices in a Power System, *Electric Power Components and Systems*, vol. 42, no. 8, 2014, 779-787, DOI: 10.1080/15325008.2014.890970.
- [46] S. Esmaeili, H.D. Dehnavi, F. Karimzadeh, Simultaneous Reconfiguration and Capacitor Placement with Harmonic Consideration Using Fuzzy Harmony Search Algorithm, *Arabian Journal for Science and Engineering*, vol. 39, no. 5, 2014, 3859-3871, DOI: 10.1007/e12260.014.0071.4

DOI: 10.1007/s13369-014-0971-4.

[47] E. Ganji, R.K. Moghaddam, A. Toloui, M. Taghizadeh, A new frequency control approach for isolated WT/FC/UC power system using improved fuzzy PSO & maximum power point tracking of the WT system, *Journal Of Intelligent & Fuzzy Systems*, vol. 27, no. 4, 2014, 1963-1976,

DOI: 10.3233/IFS-141163.

- [48] N. Glisovic, Comparison of a Fuzzy Genetic and Simulated Annealing Algorithm Approach for Project Time-Cost Tradeoff, *Journal Of Applied Mathematics*, 2014, DOI: 10.1155/2014 /817921
- [49] W. Elloumi, N. Baklouti, A. Abraham, A.M. Alimi, The multi-objective hybridization of particle swarm optimization and fuzzy ant colony optimization, *Journal of Intelligent & Fuzzy Systems*, vol. 27, no. 1, 2014, 515-525, DOI: 10.3233/IFS-131020.
- [50] E. Amiri, H. Keshavarz, M. Alizadeh, M. Zamani, T. Khodadadi, Energy Efficient Routing in Wireless Sensor Networks Based on Fuzzy Ant Colony Optimization, *International Journal Of Distributed Sensor Networks*, 2014, DOI: 10.1155/2014/768936.
- [51] V.C. Finotto, W.R.L. da Silva, P. Stemberk, M. Valasek, Sensitivity analysis of fuzzy-genetic approach applied to cabled-truss design, *Journal of Intelligent & Fuzzy Systems*, vol. 26, no. 4, 2014, 1931-1942, DOI: 10.3233/IFS-130871.
- [52] O. Kisi, Modeling solar radiation of Mediterranean region in Turkey by using fuzzy genetic approach, *Energy*, vol. 64, 2014, 429-436, DOI: 10.1016/j.energy.2013.10.009.
- [53] F. Kocabas, B. Unal, S. Unal, H.I. Fedakar, E. Gemici, Fuzzy genetic approach for modeling of the critical submergence of an intake, *Neural Computing & Applications*, vol. 23, suppl. 1, 2013, 73-82,

DOI:10.1007/s00521-012-1241-6

 [54] O. Kisi, Applicability of Mamdani and Sugeno fuzzy genetic approaches for modeling reference evapotranspiration, *Journal of Hydrology*, vol. 504, 2013, 160-170,
 DOI: 10.1016 (i ibudrol 2012.00.042)

DOI: 10.1016/j.jhydrol.2013.09.043.

[55] M. Shivaie, M.S. Sepasian, M.K. Sheikh-El-Eslami, Multi-objective transmission expansion planning based on reliability and market considering phase shifter transformers by fuzzy-genetic algorithm, *International Transactions on Electrical Energy Systems*, vol. 23, no. 8, 2013, 1468-1489,

DOI: 10.1002/etep.1672.

- [56] D. Vucetic, S.P. Simonovic, Evaluation and application of Fuzzy Differential Evolution approach for benchmark optimization and reservoir operation problems, *Journal of Hydroinformatics*, vol. 15, no. 4, 1456-1473, DOI: 10.2166/hydro.2013.118.
- [57] F. Altun, T. Dirikgil, The prediction of prismatic beam behaviours with polypropylene fiber addition under high temperature effect through ANN, ANFIS and fuzzy genetic models, *Composites Part B: Engineering*, vol. 52, 2013, 362-371, DOI: 10.1016/j.compositesb.2013.04.015.

- [58] V.C. Finotto, W.R.L. da Silva, M. Valasek, P. Stemberk, Hybrid fuzzy-genetic system for optimising cabled-truss structures, *Advances in Engineering Software*, vol. 62-63, 2013, 85-96, DOI: 10.1016/j.advengsoft.2013.04.012.
- [59] O. Kisi, T.M. Cengiz, Fuzzy Genetic Approach for Estimating Reference Evapotranspiration of Turkey: Mediterranean Region, *Water Resources Management*, vol. 27, no. 10, 2013, 3541-3553, DOI: 10.1007/s11269-013-0363-7.
- [60] F. Altun, F. Tanrioven, T. Dirikgil, Experimental investigation of mechanical properties of hybrid fiber reinforced concrete samples and prediction of energy absorption capacity of beams by fuzzy-genetic model, *Construction and Building Materials*, vol. 44, 2013, 565-574, DOI: 10.1016/j.conbuildmat.2013.03.043.
- [61] E. Sumer, M. Turker, An adaptive fuzzy-genetic algorithm approach for building detection using high-resolution satellite images. *Computers, Environment and Urban Systems*, vol. 39, 2013, 48-62,

DOI: 10.1016/ j.compenvurbsys.2013.01.004.

[62] S. Kumar, D.K. Chaturvedi, Optimal power flow solution using fuzzy evolutionary and swarm optimization, *International Journal of Electrical Power & Energy Systems*, vol. 47, 2013, 416-423,

DOI: 10.1016/j.ijepes.2012.11.019.

- [63] M.R. Chamani, S. Pourshahabi, F. Sheikholeslam, Fuzzy genetic algorithm approach for optimization of surge tanks. *Scientia Iranica*, vol. 20, no. 2, 2013, 278-285, DOI: 10.1016/j.scient.2013.04.002.
- [64] T.C. Nwaoha, Z. Yang, J. Wang, S. Bonsall, A fuzzy genetic algorithm approach for analysing maintenance cost of high risk liquefied natural gas carrier systems under uncertainty, *Journal* of Marine Engineering & Technology, vol. 12, no. 2, 57-73,

DOI: 10.1080/20464177.2013. 11020280.

- [65] A. Tsakonas, B. Gabrys, A fuzzy evolutionary framework for combining ensembles, *Applied Soft Computing*, vol. 13, no. 4, 2013, 1800-1812, DOI: 10.1016/j.asoc.2012.12.027.
- [66] A. Drira, H. Pierreval, S. Hajri-Gabouj, Design of a robust layout with information uncertainty increasing over time: A fuzzy evolutionary approach, *Engineering Applications of Artificial Intelligence*, vol. 26, no. 3, 2013, 1052-1060, DOI: 10.1016/j.engappai.2012.12.007.
- [67] J. Velagic, N. Osmic, Fuzzy-genetic identification and control stuctures for nonlinear helicopter model, *Intelligent Automation and Soft Computing*, vol. 19, no. 1, 2013, 51-68, DOI: 10.1080/10798587.2013.771454.
- [68] F. Di Martino, S. Sessa, A fuzzy particle swarm optimization algorithm and its application to hotspot events in spatial analysis, *Journal Of Ambient Intelligence And Humanized Computing*, vol. 4, no. 1, 2013, 85-97, DOI: 10.1007/s12652-011-0096-5.

- [69] O. Kisi, M. Tombul, Modeling monthly pan evaporations using fuzzy genetic approach, *Journal of Hydrology*, vol. 477, 2013, 203-212, DOI: 10.1016/j.jhydrol.2012.11.030.
- [70] V. Vembarasan, P. Balasubramaniam, K. Ratnavelu, N. Kumaresan, Robust stability analysis of delayed Takagi-Sugeno fuzzy genetic regulatory networks, *Physica Scripta*, vol. 86, no. 6, 2012, DOI 10.001/0021-0040/06/106/1065002

DOI:10.1088/0031-8949/86/06/065003.

- [71] H.R. Cheshmehgaz, H. Haron, F. Kazemipour, M.I. Desa, Accumulated risk of body postures in assembly line balancing problem and modeling through a multi-criteria fuzzy-genetic algorithm, *Computers & Industrial Engineering*, vol. 63, no. 2, 2012, 503-512, DOI: 10.1016/j.cie.2012.03.017.
- [72] J. Liu, D. Yue, Asymptotic and robust stability of T-S fuzzy genetic regulatory networks with time-varying delays, *International Journal of Robust and Nonlinear Control*, vol. 22, no. 8, 2012, 827-840, DOI: 10.1002/rnc.1729.
- [73] A. Robati, G.A. Barani, H.N.A. Pour, M.J. Fadaee, J.R.P. Anaraki, Balanced fuzzy particle swarm optimization, *Applied Mathematical Modelling*, vol. 36, no. 5, 2012, 2169-2177, DOI: 10.1016/j.apm.2011.08.006.
- [74] B.M.M. Neta, G.H.D. Araujo, F.G. Guimaraes, R.C. Mesquita, P.Y. Ekel, A fuzzy genetic algorithm for automatic orthogonal graph drawing. *Applied Soft Computing*, vol. 12, no. 4, 2012, 1379-1389,

DOI: 10.1016/j.asoc.2011.11.023.

- [75] V. Galzina, R. Lujic, T. Saric, Adaptive fuzzy particle swarm optimization for flow-shop scheduling problem, *Tehnicki Vjesnik-Technical Gazette*, vol. 19, no. 1, 2012, 151-157.

DOI: 10.3901/CJME.2012.02.255.

- [77] Y.H. Chang, C.W. Chang, C.W. Tao, H.W. Lin, J.S. Taur, Fuzzy sliding-mode control for ball and beam system with fuzzy ant colony optimization, *Expert Systems with Applications*, vol. 39, no. 3, 2012, 3624-3633, DOI: 10.1016/j.eswa.2011.09.052.
- [78] X.G. Zhang, S. Hu, D. Chen, D, X.L. Li, Fast Covariance Matching With Fuzzy Genetic Algorithm, *IEEE Transactions on Industrial Informatics*, vol. 8, no. 1, 2012, 148-157, DOI: 10.1109/TII.2011.2172453.
- [79] P. Ashtari, F. Barzegar, Accelerating fuzzy genetic algorithm for the optimization of steel structures, *Structural and Multidisciplinary Optimization*, vol. 45, no. 2, 2012, 275-287, DOI: 10.1007/s00158-011-0700-5.
- [80] M. Milenkovic, N. Bojovic, R.A. Ribeiro, N. Glisovic, A Fuzzy Simulated Annealing approach for

project time-cost tradeoff, *Journal of Intelligent & Fuzzy Systems*, vol. 23, no. 5, 2012, 203-215, DOI: 10.3233/IFS-2012-0510.

- [81] M.J. Varnamkhasti, L.S. Lee, A Fuzzy Genetic Algorithm Based on Binary Encoding for Solving Multidimensional Knapsack Problems. *Journal* of Applied Mathematics, 2012, DOI: 10.1155/2012/703601.
- [82] A.R. Babaei, M. Mortazavi, M.H. Moradi, Fuzzy-Genetic Autopilot Design for Nonminimum Phase and Nonlinear Unmanned Aerial Vehicles, *Journal of Aerospace Engineering*, vol. 25, no. 1, 2012,
 - DOI: 10.1061/(ASCE)AS.1943-5525.0000116.
- [83] F.N. Rahatabad, A.H. Jafari, A. Fallah, J. Razjouyan, A fuzzy-genetic model for estimating forces from electromyographical activity of antagonistic muscles due to planar lower arm movements: The effect of nonlinear muscle properties, *Biosystems*, vol. 107, no. 1, 2012, 56-63, DOI: 10.1016/j.biosystems.2011. 09.004.
- [84] M. Nafar, G.B. Gharehpetian, T. Niknam, Using modified fuzzy particle swarm optimization algorithm for parameter estimation of surge arresters models, *International Journal of Innovative Computing Information and Control*, vol. 8, no. 1, 2012, 567-581.
- [85] S.A. Khan, A.P. Engelbrecht, A fuzzy particle swarm optimization algorithm for computer communication network topology design, *Applied Intelligence*, vol. 36, no. 1, 2012, 161-177,

DOI: 10.1007/s10489-010-0251-2.

[86] M. Shivaie, M.S. Sepasian, M.K. Sheikh-El-Eslami, Multi-objective transmission expansion planning using fuzzy-genetic algorithm, *Iranian Journal of Science and Technology: Transactions of Electrical Engineering*, vol. 35, no. E2, 2011, 141-159,

DOI: 10.22099/ijste.2011.820.

- [87] Y.-T. Juang, S.-L. Tung, H.-C. Chiu, Adaptive fuzzy particle swarm optimization for global optimization of multimodal functions, *Information Sciences*, vol. 181, no. 20, 2011, 4539-4549, DOI: 10.1016/j.ins.2010. 11.025.
- [88] A. Alfi, M.-M. Fateh, Intelligent identification and control using improved fuzzy particle swarm optimization, *Expert Systems with Applications*, vol. 38, no. 10, 2011, 12312-12317, DOI: 10.1016/j.eswa.2011.04.009.
- [89] X.-H. Li, Y.-Z. Zhan, J. Ke, J, H.-W. Zheng, Shot retrieval based on fuzzy evolutionary aiNet and hybrid features, *Computers in Human Behavior*, vol. 27, no. 5, 2011, 1571-1578, DOI: 10.1016/j.chb.2010.11.002.
- [90] M.K. Maiti, A fuzzy genetic algorithm with varying population size to solve an inventory model with credit-linked promotional demand in an imprecise planning horizon, *European Journal* of Operational Research, vol. 213, no. 1, 2011, 96-106, DOI: 10.1016/j.ejor.2011.02.014.

[91] W. Song, L.C. Choi, S.C. Park, X.F. Ding, Fuzzy evolutionary optimization modeling and its applications to unsupervised categorization and extractive summarization, *Expert Systems with Applications*, vol. 38, no. 8, 2011, 9112-9121,

DOI: 10.1016/j.eswa.2010.12.102.

- [92] M. Amirabdollahian, M.R. Chamani, K. Asghari, Optimal design of water networks using fuzzy genetic algorithm, *Proceedings of The Institution of Civil Engineers – Water Management*, vol. 164, no. 7, 2011, 335-346, DOI: 10.1680/wama.2011.164.7.335.
- [93] S.M.H. Nabavi, S. Hajforosh, S. Hajforoosh, A. Karimi, Locating and Sizing Static Synchronous Series Compensator Using Fuzzy-Genetic Algorithm, *International Review of Electrical Engineering-I.R.E.E.*, vol. 6, no. 3, 2011, 1425-1437.
- [94] W.-A. Yang, Y. Guo, W.-H. Liao, Optimization of multi-pass face milling using a fuzzy particle swarm optimization algorithm, *The International Journal of Advanced Manufacturing Technology*, vol. 54, no. 1, 2011, 45-57, DOI: 10.1007/s00170-010-2927-5.
- [95] S.A. Jafari, S. Mashohor, M.J. Varnamkhasti, Committee neural networks with fuzzy genetic algorithm, *Journal of Petroleum Science and Engineering*, vol. 76, no. 3-4, 2011, 217-223, DOI: 10.1016/j.petrol.2011.01.006.
- [96] F. de Toro, J. Aroba, E. Ros, Computer-aided diagnosis of the paroxysmal atrial fibrillation: a fuzzy-evolutionary approach, *Applied Artificial Intelligence*, vol. 25, no. 7, 2011, 590-608, DOI: 10.1080/08839514.2011.595281
- [97] A.R. Babaei, M. Mortazavi, M.H. Moradi, Classical and fuzzy-genetic autopilot design for unmanned aerial vehicles, *Applied Soft Computing*, vol. 11, no. 1, 2011, 365-372, DOI: 10.1016/j.asoc.2009.11.027.
- [98] Ch. Venkaiah, D.M.V. Kumar, Fuzzy PSO Congestion Management using Sensitivity-Based Optimal Active Power Rescheduling of Generators, *Journal of Electrical Engineering and Technology*, vol. 6, no. 1, 2011, 32-41, DOI:10.5370/JEET.2011.6.1.032.
- [99] H. Liu, A. Abraham, A.E. Hassanien, Scheduling jobs on computational grids using a fuzzy particle swarm optimization algorithm, *Future Generation Computer Systems*, vol. 26, no. 8, 2010, 1336-1343, DOI: 10.1016/j.future.2009. 05.022.
- [100] D. Strnad, N. Guid, A fuzzy-genetic decision support system for project team formation, *Applied Soft Computing*, vol. 10, no. 4, 2010, 1178, DOI: 10.1016/j.asoc.2009.08.032.
- [101] Y.C. Sung, C.K. Su, Fuzzy genetic optimization on performance-based seismic design of reinforced concrete bridge piers with single-column type, *Optimization and Engineering*, vol. 11, no. 3, 2010, 471, DOI: 10.1007/s11081-009-9092-4.

- [102] M. Cunkas, Intelligent design of induction motors by multiobjective fuzzy genetic algorithm, *Journal of Intelligent Manufacturing*, vol. 21, no. 4, 2010, 393, DOI: 10.1007/s10845-008-0187-0.
- [103] H.J. Park, J.S. Lim, J. Roh, J.M. Kong, B.H. Min, Production-System Optimization of Gas Fields Using Hybrid Fuzzy/Genetic Approach, SPE Journal, vol. 15, no. 2, 2010, 417.
- [104] R. Parameshwaran, R. Karunakaran, C.V.R. Kumar, S. Iniyan, Energy conservative building air conditioning system controlled and optimized using fuzzy-genetic algorithm, *Energy and Buildings*, vol. 42, no. 5, 2010, 745, DOI: 10.1016/j.enbuild.2009.11.014.
- [105] T.N. Chuang, C.T. Lin, J.Y. Kung, M.D. Lin, Planning the route of container ships: A fuzzy genetic approach, *Expert Systems with Applications*, vol. 37, no. 4, 2010, 2948, DOI: 10.1016/j.eswa.2009.09.040.
- [106] M. Bousahla, B. Kadri, F.T. Bendimerad, Circular Antenna Array Synthesis Using Fuzzy Genetic Algorithm, *International Review of Electrical Engineering – I.R.E.E.*, vol. 5, no. 2, 2010, 785.
- [107] O. Kisi, Fuzzy Genetic Approach for Modeling Reference Evapotranspiration. *Journal of Irrigation and Drainage Engineering*, vol. 136, no. 3, 2010, 175,

DOI: 10.1061/(ASCE)IR.1943-4774.0000147.

- [108] T.S. Shih, J.S. Su, C.F. Fuh, H.M. Lee, Applying fuzzy genetic algorithms to solve a fuzzy inventory with backorder problem, *International Journal of Innovative Computing Information and Control*, vol. 6, no. 1, 2010, 229.
- [109] Z.H. Peng, B. Song, Research on fault diagnosis method for transformer based on fuzzy genetic algorithm and artificial neural network. *Kybernetes*, 39(8), 2010, 1235. DOI: 10.1108/03684921011063510
- [110] C.W. Tao, J.S. Taur, J.T. Jeng, W.Y. Wang, A Novel Fuzzy Ant Colony System for Parameter Determination of Fuzzy Controllers. *International Journal of Fuzzy Systems*, 11(4), 2009, 298.
- [111] R. Shad, M.S. Mesgari, A. Abkar, A. Shad, Predicting air pollution using fuzzy genetic linear membership kriging in GIS. *Computers Environment And Urban Systems*, 33(6), 2009, 472. DOI: 10.1016/j.compenvurbsys.2009.10.004
- [112] A. Roy, S. Pal, M.K. Maiti, A production inventory model with stock dependent demand incorporating learning and inflationary effect in a random planning horizon: A fuzzy genetic algorithm with varying population size approach. *Computers & Industrial Engineering*, 57(4), 2009, 1324.

DOI: 10.1016/j.cie.2009.07.008

[113] S. Saha, S. Bandyopadhyay, A new point symmetry based fuzzy genetic clustering technique for automatic evolution of clusters. *Information Sciences*, 179(19), 2009, 3230. DOI: 10.1016/j.ins.2009.06.013 [114] P. Hanafizadeh, M.H. Sherkat, Designing fuzzy-genetic learner model based on multi-agent systems in supply chain management. *Expert Systems With Applications*, 36(6), 2009, 10120.

DOI: 10.1016/j.eswa.2009.01.008

- [115] S.G. Li, Y.L. Rong, The reliable design of onepiece flow production system using fuzzy ant colony optimization. *Computers & Operations Research*, 36(5), 2009, 1656. DOI: 10.1016/j.cor.2008.03.010
- [116] H.C.W. Lau, C.X.H. Tang, G.T.S. Ho, T.M. Chan, A fuzzy genetic algorithm for the discovery of process parameter settings using knowledge representation. *Expert Systems With Applications*, 36(4), 2009, 7964. DOI: 10.1016/j.eswa.2008.10.088
- [117] D. Srinivasan, L. Rachmawati, Efficient Fuzzy Evolutionary Algorithm-Based Approach for Solving the Student Project Allocation Problem. *IEEE Transactions On Education*, 51(4), 2008, 439.
 DOI: 10.1109/TE.2007.912537
- [118] M.Y.H. Al-Shamri, K.K. Bharadwaj, Fuzzy-genetic approach to recommender systems based on a novel hybrid user model. *Expert Systems With Applications*, 35(3), 2008, 1386. DOI: 10.1016/j.eswa.2007.08.016
- [119] J.X. Wei, Y.P. Wang, (2008). Multi-objective fuzzy particle swarm optimization based on elite archiving and its convergence. *Journal Of Systems Engineering And Electronics*, 19(5), 1035.
- [120] M. Cunkas, A. Urkmez, Design Optimization of Submersible Induction Motors by Multiobjective Fuzzy Genetic Algorithm. *Journal Of The Faculty Of Engineering And Architecture Of Gazi University*, 23(3), 2008, 645.
- [121] W.G. Sheng, G. Howells, M. Fairhurst, F. Deravi, Template-free biometric-key generation by means of fuzzy genetic clustering. *IEEE Transactions On Information Forensics And Security*, 3(2), 2008, 183.
 - DOI: 10.1109/TIFS.2008.922056
- [122] F.C. Li, L.M. Liu, Y. Shi, Fuzzy genetic algorithm based on principal indices operation and quasi-linear fuzzy number and its performance. *International Journal Of Innovative Computing Information And Control*, 4(6), 2008, 1455.
- J. Otero, L. Sanchez, J. Alcala-Fdez, Fuzzy-genetic optimization of the parameters of a low cost system for the optical measurement of several dimensions of vehicles. *Soft Computing*, 12(8), 2008, 751.
 DOI: 10.1007/s00500-007-0234-3
- [124] S.V. Ustun, M. Demirtas, Optimal tuning of PI coefficients by using fuzzy-genetic for V/f controlled induction motor. *Expert Systems With Applications*, 34(4), 2008, 2714. DOI: 10.1016/j.eswa.2007.05.029
- [125] M.M.O. Sidi, S. Hammadi, S. Hayat, P. Borne, Urban transport network regulation and eval-

uation: A fuzzy evolutionary approach. *IEEE Transactions On Systems Man And Cybernetics Part A-Systems And Humans*, 38(2), 2008, 309. DOI: 10.1109/TSMCA.2007.914789

- [126] C.H. Chen, V.S. Tseng, T.P. Hong, Cluster-based evaluation in fuzzy-genetic data mining. *IEEE Transactions On Fuzzy Systems*, 16(1), 2008, 249. DOI: 10.1109/TFUZZ.2007.903327
- [127] M. Boulif, K. Atif, (2008). A new fuzzy genetic algorithm for the dynamic bi-objective cell formation problem considering passive and active strategies. *International Journal Of Approximate Reasoning*, 47(2), 141. DOI: 10.1016/j.ijar.2007.03.003
- [128] F.C. Li, C.X. Jin, P.X. Yue, Operation for a new kind of fuzzy genetic algorithm based on the transformation of the principle index. *International Journal Of Pattern Recognition And Artificial Intelligence*, 22(1), 2008, 17. DOI: 10.1142/S0218001408006053
- [129] A.R. Carvalho, H.F.D. Velho, S. Stephany, R.P. Souto, J.C. Becceneri, S. Sandri, Fuzzy ant colony optimization for estimating chlorophyll concentration profile in offshore sea water. *Inverse Problems In Science And Engineering*, 16(6), 2008, 705. DOI: 10.1080/17415970802083276
- [130] R.A. Aliev, B. Fazlollahi, B.G. Guirimov, R.R. Aliev, Fuzzy-genetic approach to aggregate production-distribution planning in supply chain management. *Information Sciences*, 177(20), 2007, 4241.

DOI: 10.1016/j.ins.2007.04.012

- [131] W.X. Li, L.F. Dai, X.B. Hou, W. Lei, Fuzzy genetic programming method for analysis of ground movements due to underground mining. *International Journal Of Rock Mechanics And Mining Sciences*, 44(6), 2007, 954. DOI: 10.1016/j.ijrmms.2007.02.003
- [132] K.D. Rao, V. Gopika, H.S. Kushwaha, A.K. Verma, A. Srividya, Test interval optimization of safety systems of nuclear power plant using fuzzy-genetic approach. *Reliability Engineering & System Safety*, 92(7), 2007, 895. DOI: 10.1016/j.ress.2006.05.009
- [133] C.H. Lo, P.T. Chan, Y.K. Wong, A.B. Rad, K.L. Cheung, Fuzzy-genetic algorithm for automatic fault detection in HVAC systems. *Applied Soft Computing*, 7(2), 2007, 554. DOI: 10.1016/j.asoc.2006.06.003
- [134] H.M. Feng, C.Y. Chen, F. Ye, Evolutionary fuzzy particle swarm optimization vector quantization learning scheme in image compression. *Expert Systems With Applications*, 32(1), 2007, 213.

DOI: 10.1016/j.eswa.2005.11.012

[135] N.C. Sahoo, K. Prasad, A fuzzy genetic approach for network reconfiguration to enhance voltage stability in radial distribution systems. *Energy Conversion And Management*, 47(18), 2006, 3288.

DOI: 10.1016/j.enconman.2006.01.004

- [136] S. Kaushik, A. Khandelwal, Information filtering using fuzzy-genetic algorithm approach. *IETE Journal Of Research*, 52(4), 2006, 295.
- [137] F.C. Li, S.X. Luo, L.Q. Su, A kind of fuzzy genetic algorithm based on rule and its performance research. *Advances In Machine Learning And Cybernetics*, 3930, 2006, 347.
- [138] F.C. Li, P.X. Yue, L.Q. Su, Research on the convergence of fuzzy genetic algorithm based on rough classification. *Advances In Natural Computation*, PT 1, 4221, 2006, 792.
- [139] C. Koutsojannis, I. Hatzilygeroudis, Fuzzy-evolutionary synergism in an intelligent medical diagnosis system. *Knowledge-Based Intelligent Information And Engineering Systems, PT* 2, PROCEEDINGS, 4252, 2006, 1313.
- [140] R.H. Abiyev, M. Menekay, Fuzzy genetic system for modelling investment portfolio. *Pricai 2006: Trends In Artificial Intelligence, Proceedings*, 4099, 2006, 701.
- [141] L.B. Cao, D. Luo, C.Q. Zhang, Fuzzy genetic algorithms for pairs mining. *Pricai 2006: Trends In Artificial Intelligence, Proceedings*, 4099, 2006, 711.
- B.D.L.P. de Lima, B.P. Jacob, N.F.F Ebecken, A hybrid fuzzy/genetic algorithm for the design of offshore oil production risers. *International Journal For Numerical Methods In Engineering*, 64(11), 2005, 1459.
 DOI: 10.1002/nme.1416
- [143] R.J. Kuo, Y.P. Kuo, K.Y. Chen, Developing a diagnostic system through integration of fuzzy case-based reasoning and fuzzy ant colony system. *Expert Systems With Applications*, 28(4), 2005, 783.
 DOI: 10.1016/j.eswa.2004.12.034
- [144] S. Mishra, A hybrid least square-fuzzy bacterial foraging strategy for harmonic estimation. *IEEE Transactions On Evolutionary Computation*, 9(1), 2005, 61.
 DOI: 10.1109/TEVC.2004.840144
- [145] F.C. Bertoni, S.D. Zorzo, QoS evaluation method in multimedia applications using a fuzzy genetic rule-based system. *Computer And Information Sicences – ISCIS 2005, Proceedings*, 3733, 2005, 254.
- [146] C. Fayad, S. Petrovic, A fuzzy genetic algorithm for real-world job shop scheduling. *Innovations In Applied Artificial Intelligence*, 3533, 2005,524.
- [147] H. Youssef, S.M. Sait, S.A. Khan, A fuzzy evolutionary algorithm for topology design of campus networks. *Arabian Journal For Science And Engineering*, 29(2), 2004, 195.
- [148] H. Galda, H. Murao, H. Tamaki, S. Kitamura, Dermoscopic image segmentation by a self-organizing map and fuzzy genetic clustering. *IEICE Transactions On Information And Systems* (9), 2004, 2195.
- [149] Y.K. Chen, C. Yeh, An enhancement of DSI (X) over-bar control charts using a fuzzy-genetic

approach. *International Journal Of Advanced Manufacturing Technology*, 24(1), 2004, 32. DOI: 10.1007/s00170-003-1706-y

- [150] P. Kumar, V.K. Chandna, M.S. Thomas, Fuzzy-genetic algorithm for pre-processing data at the RTU. *IEEE Transactions On Power Systems*, 19(2), 2004, 718. DOI: 10.1109/TPWRS.2004.825924
- [151] O. Kisi, Daily suspended sediment modelling using a fuzzy differential evolution approach. *Hydrological Sciences Journal-Journal Des Sciences Hydrologiques*, 49(1), 2004, 183.
- [152] S. Aydin, H. Temeltas, Fuzzy-differential evolution algorithm for planning time-optimal trajectories of a unicycle mobile robot on a predefined path. *Advanced Robotics*, 18(7), 2004, 725.
 - DOI: 10.1163/1568553041719456
- [153] H. Hagras, V. Callaghan, M. Colley, Learning and adaptation of an intelligent mobile robot navigator operating in unstructured environment based on a novel online Fuzzy-Genetic system. *Fuzzy Sets And Systems*, 141(1), 2004, 107. DOI: 10.1016/S0165-0114(03)00116-7
- [154] P. Chutima, W. Nimmano, C. Yiangkamolsing, Application of fuzzy genetic algorithm for sequencing in mixed-model assembly line with processing time. *International Journal Of Industrial Engineering-Theory Applications And Practice*, 10(4), 2003, 325.
- [155] M.Y. El-Sharkh, A.A. El-Keib, H. Chen, A fuzzy evolutionary programming-based solution methodology for security-constrained generation maintenance scheduling. *Electric Power Systems Research*, 67(1), 2003, 67. DOI: 10.1016/S0378-7796(03)00076-2
- [156] J.P. Li, R.S.K. Kwan, A fuzzy genetic algorithm for driver scheduling. *European Journal Of Operational Research*, 147(2), 2003, 334. DOI: 10.1016/S0377-2217(02)00564-7
- [157] M.Y. El-Sharkh, A.A. El-Keib, Maintenance scheduling of generation and transmission systems using fuzzy evolutionary programming. *IEEE Transactions On Power Systems*, 18(2), 2003, 862.
 - DOI: 10.1109/TPWRS.2003.811004
- [158] S. Hajri-Gabouj, A fuzzy genetic multiobjective optimization algorithm for a multilevel generalized assignment problem. *IEEE Transactions On Systems Man And Cybernetics Part C-Applications And Reviews*, 33(2), 2003, 214. DOI: 10.1109/TSMCC.2003.814033
- P. Chen, T.L. Dong, A fuzzy genetic algorithm for QoS multicast routing. *Computer Communications*, 26(6), 2003, 506.
 DOI: 10.1016/S0140-3664(02)00183-4
- [160] H. Hagras, V. Callaghan, M. Colley, G. Clarke, A hierarchical fuzzy-genetic multi-agent architecture for intelligent buildings online learning, adaptation and control. *Information Sciences*, 150(1), 2003, 33.
 DOI: 10.1016/S0020-0255(02)00368-7

- [161] M.B. Shim, M.W. Suh, Crack identification using neuro-fuzzy-evolutionary technique. *KSME International Journal*, 16(4), 2002, 454.
- [162] T. Gunel, I. Erer, Application of fuzzy genetic algorithm to the problem of synthesizing circular microstrip antenna elements with thick substrates. *AEU-International Journal Of Electronics And Communications*, 56(3), 2002, 215.

DOI: 10.1078/1434-8411-54100099

- P. Melin, O. Castillo, Intelligent control of complex electrochemical systems with a neuro-fuzzy-genetic approach. *IEEE Transactions On Industrial Electronics*, 48(5), 2001, 951.
 DOI: 10.1109/41.954559
- [164] R. Bandyopadhyay, U.K. Chakraborty, D. Patranabis, Autotuning a PID controller: A fuzzy-genetic approach. *Journal Of Systems Architecture*, 47(7), 2001, 663. DOI: 10.1016/S1383-7621(01)00022-4
- [165] A. Gonzalez, R. Perez, Selection of relevant features in a fuzzy genetic learning algorithm. *IEEE Transactions On Systems Man And Cybernetics Part B-Cybernetics*, 31(3), 2001, 417. DOI: 10.1109/3477.931534
- [166] Y.T. Huang, T.D. Gedeon, P.M. Wong, An integrated neural-fuzzy-genetic-algorithm using hyper-surface membership functions to predict permeability in petroleum reservoirs. *Engineering Applications Of Artificial Intelligence*, 14(1), 2001, 15.

DOI: 10.1016/S0952-1976(00)00048-8

- [167] H. Youssef, S.M. Sait, S.A. Khan, Fuzzy evolutionary hybrid metaheuristic for network topology design. *Evolutionary Multi-Criterion Optimization, Proceedings*, 1993, 2001, 400.
- [168] H. Youssef, S.M. Sait, E. Shragowitz, H. Adiche, Fuzzy genetic algorithm for floorplanning. Engineering Intelligent Systems For Electrical Engineering And Communications, 8(3), 2000, 145.
- [169] D. Srinivasan, R.L. Cheu, Y.P. Poh, A.K.C. Ng, Automated fault detection in power distribution networks using a hybrid fuzzy-genetic algorithm approach. *Engineering Applications Of Artificial Intelligence*, 13(4), 2000, 407. DOI: 10.1016/S0952-1976(00)00012-9
- [170] K.C. Sarma, H. Adeli, Fuzzy genetic algorithm for optimization of steel structures. *Journal Of Structural Engineering-Asce*, 126(5), 2000, 596.
 DOI: 10.1061/(ASCE)0733-9445(2000)126:5 (596)
- [171] T. Senjyu, A. Miyazato, K. Uezato, Enhancement of transient stability of multi-machine power systems by using fuzzy-genetic controller. *Journal Of Intelligent & Fuzzy Systems*, 8(1), 2000, 19.
- [172] C.A. Pena-Reyes, M. Sipper, A fuzzy-genetic approach to breast cancer diagnosis. *Artificial Intelligence In Medicine*, 17(2), 1999, 131. DOI: 10.1016/S0933-3657(99)00019-6

- [173] M.J. Martin-Bautista, M.A. Vila, H.L. Larsen, A fuzzy genetic algorithm approach to an adaptive information retrieval agent. *Journal Of The American Society For Information Science*, 50(9), 1999, 760.
 DOI: 10.1002/(SICI)1097-4571(1999)50:9< 760::AID-ASI4>3.3.CO;2-F
- [174] D.K. Pratihar, K. Deb, A. Ghosh, Fuzzy-genetic algorithms and time-optimal obstacle-free path generation for mobile robots. *Engineering Optimization*, 32(1), 1999, 117. DOI: 10.1080/03052159908941294
- S. Voget, Multidimensional optimization with a fuzzy genetic algorithm. *Journal Of Heuristics*, 4(3), 1998, 221.
 DOI: 10.1023/A:1009661616702
- [176] M. Russo, (1998). FuGeNeSys A fuzzy genetic neural system for fuzzy modeling. *IEEE Transactions On Fuzzy Systems*, 6(3), 373. DOI: 10.1109/91.705506
- [177] F. Cicalese, V. Loia, A fuzzy evolutionary approach to the classification problem. *Journal Of Intelligent & Fuzzy Systems*, 6(1), 1998, 117.
- [178] H.W. Chen, N.B. Chang, Water pollution control in the river basin by fuzzy genetic algorithm-based multiobjective programming modeling. *Water Science And Technology*, 37(8), 1998, 55.

DOI: 10.1016/S0273-1223(98)00258-3

- [179] A. TrebiOllennu, B.A. White, Multiobjective fuzzy genetic algorithm optimisation approach to nonlinear control system design. *IEE PROCEEDINGS-Control Theory And Applications*, 144(2), 1997, 137. DOI: 10.1049/ip-cta:19971031
- [180] A.L. Buczak, R.E. Uhrig, Hybrid fuzzy Genetic technique for multisensor fusion. *Information Sciences*, 93(3), 1996, 265.
 DOI: 10.1016/0020-0255(96)00078-3
- [181] S.K. Pal, D. Bhandari, Genetic Algorithms with Fuzzy Fitness Function for Object Extraction Using Cellular Networks. *Fuzzy Sets And Systems*, 65(2), 1994, 129. DOI: 10.1016/0165-0114(94)90017-5
- [182] J.J. Buckley, Y. Hayashi, Fuzzy Genetic Algorithm and Applications. *Fuzzy Sets And Systems*, 61(2), 1994, 129.
 DOI: 10.1016/0165-0114(94)90228-