September 2014

# A Brief Review of Cuckoo Search Algorithm (CSA) Research Progression from 2010 to 2013

E. F. Shair, S. Y. Khor, A. R. Abdullah, H. I. Jaafar, N. Mohd Ali, A. F. Zainal Abidin

**Abstract** – Cuckoo Search Algorithm is a new swarm intelligence algorithm which based on breeding behavior of the Cuckoo bird. This paper gives a brief insight of the advancement of the Cuckoo Search Algorithm from 2010 to 2013.

The first half of this paper presents the publication trend of Cuckoo Search Algorithm. The remaining of this paper briefly explains the contribution of the individual publication related to Cuckoo Search Algorithm. It is believed that this paper will greatly benefit the reader who needs a bird-eyes view of the Cuckoo Search Algorithm's publications trend. Copyright © 2014 Praise Worthy Prize S.r.l. - All rights reserved.

Keywords: Cuckoo Search Algorithm, Publication Trend, Swarm Intelligence

#### T. Introduction

Nowadays, Swarm Intelligence (SI) algorithms have become famous due to its simplicity. In fact, there are numerous SI algorithms that have become visible and often being applied in real world problems. Particle Swarm Optimization (PSO), Ant Colony Optimization (ACO), Genetic Algorithm (GA) and Differential Evolution (DE) are few examples of the well-established SI algorithms [1].

On the other hand, Cuckoo Search Algorithm (CSA) is considered to be one of the latest SI algorithms [1]. It is based on breeding and Levy-flight based foraging behavior of the Cuckoo birds. Based on the finding of the original author, CSA is considered a superior algorithm which surpasses PSO and GA [2].

The publication papers include journals conference proceedings are accumulated from wellestablished online databases like IEEE Explore, Scopus, ScienceDirect, Elsevier and Scientific.Net. The keyword "Cuckoo Search Algorithm" is used to search the papers. After collecting papers from the online databases, the process of elimination is done to get rid of unwanted and unrelated papers. Lastly, it only left with 71 papers related to CSA.

In these 71 papers, there are 27 papers brief about the modifications or hybridizations of CSA and the rest are application of original CSA. The papers are collected from 2010 to 2013.

Note that the analysis of the publications of CSA is based on the framework in [3].

Only information that tells the development of CSA that also includes the number of publications, year of publications, journal and countries' institutions are acquired through collecting and analyzing 71 papers related to CSA.

#### II. Format of Manuscript

# Publication by Year

Fig. 1 indicates the number of publication of CSA on yearly basis from year 2010 to 2013. It is clearly seen that the number of publication increases in exponential order throughout the 4 years duration.

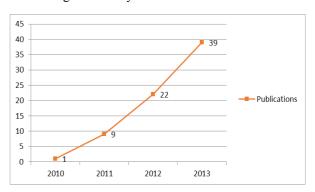


Fig. 1. Number of publications by year

#### Publication by Type of Publication

From the 71 papers, there are 43 journals and 28 conference proceedings. Table I shows the contribution of journals towards CSA publications. These are the few scientific journals that contributed the most; International Journal of Bio-Inspired Computation (3 papers), Journal of Applied Mathematics (3 papers), and Advances in Intelligent Systems and Computing (4 papers).

#### II.3. Publication by Country

Besides analysis of publications by year and type of publications, countries of publications are also recorded and the most notable publications comes from India

which contributed 22% from the total publications of CSA. This follows by China (22.5%), Malaysia (11.2%) and United Kingdom (8.4%). Countries that contribute around 1% of the total publications are from United States, Sweden, Romania, Germany, Algeria, Mexico and Jordan. Table II shows number of publications and the percentage of publications of each country which involved.

TABLE I JOURNALS/ PROCEEDINGS

No	Journals/ Proceedings	No of
110	Journals/ Froceedings	papers
1	Electrical Engineering/Electronics, Computer,	1
	Telecommunications and Information	
	Technology	
2	Communications and Information Technologies:	1
3	Advances in Intelligent Systems and Computing	4
4	AIP Conference Proceedings	1
5	Applied Mathematics and Information Sciences	2
6	Journal of Beijing Jiaotong University	1
7	American Journal of Applied Sciences	1
8	Computers and Industrial Engineering	1
9	Engineering with Computers	1
10	Computers and Operations Research	1
11	Energy Education Science and Technology	1
12	Expert Systems with Applications	1
13	IET Microwaves, Antennas and Propagation	1
14	Power Engineering, Energy and Electrical Drives	1
15	Indian Journal of Science and Technology	1
16	International Journal of Advanced Manufacturing	2
	Technology	
17	International Journal of Bio-Inspired	3
	Computation	
18	International Review on Computers and Software	1
19	Journal of Applied Mathematics	3
20	Journal of Experimental and Theoretical	1
	Artificial Intelligence	
21	Journal of Theoretical and Applied Information	1
	Technology	
22	Journal of Theoretical and Applied Information	2
	Technology	
23	Mechanism and Machine Theory	1
24	IEEE International Advance Computing	1
	Conference	
25	International Conference on Advances	1
26	Research Journal of Applied Sciences,	1
	Engineering and Technology	
27	Swarm and Evolutionary Computation	1
28	Structural Design of Tall and Special Buildings	2

TABLE II COUNTRY OF ORIGINS

	COUNTR	1 of Oldonio	
No.	Country	Number of Publications	Percentage
1	India	22	30.9
2	China	16	22.5
3	Malaysia	8	11.2
4	U.K	6	8.4
5	Iran	4	5.6
6	Thailand	4	5.6
7	Serbia	2	2.8
8	Turkey	2	2.8
9	USA	1	1.4
10	Sweden	1	1.4
11	Romania	1	1.4
12	Germany	1	1.4
13	Algeria	1	1.4
14	Mexico	1	1.4
15	Jordan	1	1.4

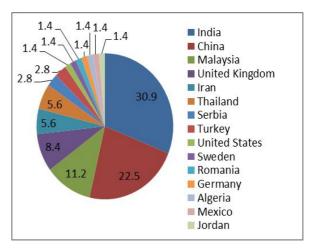


Fig. 2. Country of Publications

### II.4. Publication by Type of Contribution

Most of the CSA publications can be divided into three main area of contributions: CSA modification, hybridization of CSA, and the application of the CSA.

Based on our findings, there are 14 papers related to CSA modification which majority shows improvement from the original CSA, 13 papers related to the hybridization of CSA with other optimization algorithms, and 66 papers including those of the CSA modification papers and CSA hybridization papers are related to the applications of CSA.

## Modifications of CSA

The improvement of CSA has been growing from 2010. There are various enhancement done on CSA performance and Table III states the modification of CSA.

### **Hybridizations of CSA**

There are many combinations or hybridization of CSA with other algorithms are also been introduced. These combinations have bought great advancement in term of performance: better fitness value or faster convergence rate, which outperforms CSA itself, PSO, GA, ACO and etc. The following Table IV shows the result of the combination of CSA.

### Applications of CSA

The interests in exploiting CSA capabilities lead to the increase of application of CSA in various areas. The main areas are Computer Science, Mathematics, Energy, Engineering, etc. Table V shows the areas and applications of CSA.

### III. Conclusion

In this paper, the development of CSA has been reviewed from 2010 to 2013. CSA is still considered as a new algorithm, but its growth is remarkable during these four year.

### TABLE III CSA MODIFICATIONS

Author	Technique	CSA MODIFICATIONS  Modification/Problem	Result	Ref.
71 V 71 V 1	1 (34 (334)	No. 100	100	503
Zhou, Y., Zheng, H., Luo, Q., Wu, J.	Improved CSA (ICSA)	Modification: Three strategies are introduced: walking one strategies, swap and inversion strategies and greedy strategies Problem: Solving planar graph coloring problem	ICS is more efficient and accurate than modified PSO towards graph coloring problem	[2]
Zheng, H., Luo, Q., Zhou, Y.	Cuckoo Search Algorithm and Simplex Method (SMCS)	Modification: Combination of excellence global finding capability of CS and excellence local finding capability and fast convergence of SM Problem: Improving converged speed and solution precision of cuckoo search algorithm	Calculation accuracy and convergence speed and performance of SMCS is better than CS	[4]
Zhang, Y., Wang, L., Wu, Q.	Modified Adaptive Cuckoo Search	Modification: MACS includes grouping, incentive, adaptive and information-sharing characteristic.  Problem: Improving the strategies of formal descriptions	MACS outperforms basic CS algorithm in test problem	[5]
Zheng, H., Zhou, Y., He, S., Ouyang, X.	Discrete Cuckoo Search Algorithm	Modification: Discrete Binary Cuckoo Search (DBCS) is designed to meet the need of qualitative distinction between variables.  Problem: Solving knapsack problem	DBCS perform better due to it has a better convergence speed and accuracy	[6]
Zhao, P., Li, H.	Opposition-Based Cuckoo Search Algorithm (OCS)	Modification: Combine the opposition-based learning into CS algorithm and the OCS algorithm for the benefit of best solution.  Problem: Improving the searching of solution space	OCS shows its superiority in exploitation	[7]
Ouyang, X., Zhou, Y., Luo, Q., Chen, H.	Novel Discrete Cuckoo Search Algorithm	in solving optimization problems  Modification: Discrete Cuckoo Search Algorithm generate a city number of every call.  Problem: Solving spherical Traveling Salesman Problem which includes all points locate on the surface of the sphere		[8]
Yang, XS., Deb, S.	Multi- objective Cuckoo Search Algorithm (MOCS)	Modification: Cuckoo Search combines with	Performance of the overall search moves of MOCS is more subtle compare to PSO	[9]
Abdul Rani, K.N., Hoon, W.F., Abd Malek, M.F., Mohd Affendi, N.A., Mohamed, L., Saudin, N., Ali, A., Neoh, S.C.	Modified Cuckoo search (MCS) algorithm	1		[10]
Chaowanawatee, K., Heednacram, A.	Improved Cuckoo Search (ICS) algorithm	Modification: Gaussian distribution involves in producing a cuckoo egg Problem: Solving training network problem in the classical method	CSA via Gaussian distribution perform better in time taken and prediction error.	[11]
Saelim, A., Rasmequan, S., Kulkasem, P., Chinnasarn, K., Rodtook, A.	Modified Cuckoo search (MCS) algorithm		MCS perform better than ACO and originally CSA	[12]
Tuba, M., Subotic, M., Stanarevic, N.	Modified Cuckoo search (MCS) algorithm	Modification: From the sorted section determines the step size, instead of permuted fitness matrix Problem: Solving unconstrained optimization problems	Performance of MCS is better compare to originally CSA	[13]
Layeb, A.	Novel Quantum Cuckoo Search	Modification: Cuckoo search Algorithm corporate with some of quantum computing principles Problem: Solving Knapsack problems	Ability of the novel quantum cuckoo search shows a good quality in obtaining solutions	[14]
Wang, L., Yang, S., Zhao, W.	Improved Cuckoo Search (ICS) Algorithm	Modification: CSA is improved by focusing on dynamic detection probability, step length and levy flight method Problem: Solving structure damage characteristics of bridge erecting machines	Improvement in	[15]
Walton, S., Hassan, O., Morgan, K.,Brown, M.R.	Modified Cuckoo Search (MCS) Algorithm	Modification: Modify best solution by adding addition information exchange between the top eggs Problem: Modify cuckoo search to improve its robustness	Performance of MCS is better compare CSA	[16]

# TABLE IV CSA HYBRIDIZATIONS

Author	Technique/ Hybridization	Problem	Result	Ref.
Babukarthik,	Technique:	Solving job	perform better in minimizing the implementation	[18]
Raju,	ACO and CSA	schedule	time in job schedule	
Dhavachelvan	Hybridization: Combination of ACO and CSA	problem		
Kanagaraj,	Technique:	Reliability and	Outperform PSO and ABC in searching the feasible	[1 <b>7</b> ]
Ponnambalam,	CSA and GA	redundancy	solution	[1/]
Jawahar	Hybridization:	allocation		
	Combination of CSA and GA	problem		
Karthikeyan &	Technique:	Solving the	Better performance of PSO and CSA in extending	[19]
Venkatalakshmi		clustering to	the lifespan of network by utilizing more in	
	Hybridization:	increase the	advanced nodes and also minimize the	
	PSO incorporated CSA	Wireless Sensor	communication distance compare to GA	
		Network's		
Chandrasekaran	Technique:	lifespan Solving multi	The feasibility and performance of fuzzy and CSA	[20]
, K., Simon,	Fuzzy and CSA	objective unit	outperform Hybrid GA and PSO	[20]
S.P.	Hybridization:	commitment		
	Binary coded CSA deals with economic dispatch	problem		
	problem (EDP) assisted by fuzzy which generates	(MOUCP)		
	boundary variables.			
Srivastava,	Technique:	Solving software	Perform better in producing optimal test cases	[21]
Khandelwal,	CSA and and Tabu mechanism	testing to	compare to GA	
Khandelwal,	Hybridization: Combination of the strength of CSA in converging	produce a feasible test		
Kumar, Ranganatha	and tabu mechanism in backtracking from Lévy flight.			
Zheng, H.,	Technique:		Performance of GSA and CSA is superior in	[22]
Zhou, Y., Guo,	CSA and GA		searching the objective function values and	[]
P.	Hybridization:	with runway	computational time compare to GA and GLS	
	CSA fine-tune the initial population with the	dependent	•	
	assistance of GA	attributes		
Wang, G., Guo,		Solving the	DE and CSA is more effective and feasible in	[23]
L., Duan, H.,	DE and CSA	Unmanned	UCAV path planning compare to basic CS	
Liu, L., Wang, H., Wang, J.	Hybridization: DE optimize the process of CSA	Combat Air Vehicle (UCAV)		
II., wang, J.	DE optimize the process of CSA	three-		
		dimensional path		
		planning		
		problem		
Zheng, H.,	Technique:	Solving standard	GCS perform much better than CS in getting the	[24]
Zhou, Y.	CSA and Gauss Distribution (GCS)	test functions	feasible solution	
	Hybridization:	and engineering		
	Low convergence of rate of cuckoo search algorithm	design		
	basing on Gauss Distribution	optimization problems		
Nawi, N.M.,	Technique:	Solving the	Performance of CSLM is better than other	[25]
Khan, A.,	CSA and Levenberg-	occurrence of	algorithms which is listed	[23]
	Marquardt (CSLM) Algorithm	stuck in		
	Hybridization:	minimum and		
	The improve Levenberg-	the stagnant		
	Marquardt Back Propagation (LMBP) algorithm is	network		
	complete with CSA to avoid the problem of local			
Nami NIM	minima	Calarina	CCDD	[27]
Nawi, N.M., Khan, A.,	Technique: CSA and Back-Propagation neural network (CSBP)	Solving occurrence of	CSBP performs better compare to Artificial Bee Colony (ABC) combined with Back-Propagation	[26]
Rehman, M.Z.	Algorithm	stuck in local	Algorithm	
Kemman, W.Z.	Hybridization:	minimum and	Aigorium	
	Back-Propagation neural network is integrated with	slow		
	CSA to avoid local minimum problem	convergence		
	1	speed		
Kavousi-Fard,	Technique:	Determining the	The combination of algorithms improve the	[27]
A., Kavousi-	Autoregressive integrated moving average (ARIMA),	reliability of	accuracy of forecasting result and also the search	
Fard, F.	CSA and Support Vector Regression (SVR)	forecasting result	ability	
	Hybridization			
	Hybridization:			
	ARIMA corporate with CSA and SVR to obtain more accurate forecasting			
		Solving	The performance of CCCS is good in generating the	[28]
Zheng H	Lechnique.	~ U1 1 1115	performance of ecco is good in generating the	[20]
Zheng, H., Zhou, Y.	Technique: Co-	optimization and	quality of solution and it is more robust	
Zheng, H., Zhou, Y.	Co- evolutionary Cuckoo Search (CCCS) algorithm	optimization and engineering	quality of solution and it is more robust	
-	Co-		quality of solution and it is more robust	

Author	Technique/ Hybridization	Problem	Result	Ref.
	evolutionary and cuckoo search algorithm which includes population of organization and organization of dynamic individuals			
Li, XT., Yin, MH.	Technique: CSA and Orthogonal strategy	Improving the estimation of parameter of	The performance of this algorithm is better compare to PSO and GE in getting a quality solution	[29]
	Hybridization: Combination of the stochastic exploration (CS) and the exploitation capability (orthogonal learning strategy)	Lorenz system and Chen system		

#### TABLE V CSA APPLICATIONS

Area	Applications	Authors	Year	Ref
Computer Science	Solve structural optimization problems	Gandomi, A.H., Yang, XS., Alavi, A.H.	2013	[1]
	Solving planar graph coloring problem	Zhou, Y., Zheng, H., Luo, Q., Wu, J.	2013	[2]
	A novel hybrid Cuckoo Search algorithm based on simplex operator	Zheng, H., Luo, Q., Zhou, Y.	2012	[4]
	Formal description for global optimization	Zhang, Y., Wang, L., Wu, Q.	2012	[5]
	Solving knapsack problems	Zheng, H., Zhou, Y., He, S., Ouyang, X.	2012	[6]
	Opposition- based cuckoo search algorithm for optimization problems	Zhao, P., Li, H.	2012	[7]
	Spherical traveling salesman problem	Ouyang, X., Zhou, Y., Luo, Q., Chen, H.	2013	[8]
	Design optimization	Yang, XS., Deb, S.	2013	[9]
	Migration planning	Saelim, A., Rasmequan, S., Kulkasem, P., Chinnasarn, K., Rodtook, A.	2013	[12]
	Unconstrained optimization problems	Tuba, M., Subotic, M., Stanarevic, N.	2012	[13]
	Reliability-	Kanagaraj G., Ponnambalam S.G., Jawahar N	2013	[17]
	Redundancy Allocation Problems	89,		[/]
	Job scheduling	Babukarthik R.G., Raju R., Dhavachelvan P.	2013	[18]
	Multi-objective scheduling problem	Chandrasekaran, K., Simon, S.P.	2012	[20]
	Automated test data generation	Srivastava, P.R., Khandelwal, R., Khandelwal, S.,	2012	[21]
		Kumar, S., Ranganatha, S.S.		. ,
	A novel Cuckoo Search optimization algorithm base on gauss distribution	Zheng, H., Zhou, Y.	2012	[24]
	A new Cuckoo Search Based Levenberg- Marquardt (CSLM) algorithm	Nawi, N.M., Khan, A., Rehman, M.Z.	2013	[26]
	Correction method for short-term load forecasting	Kavousi-Fard, A., Kavousi-Fard, F.	2013	[27]
	Channel estimation of MIMO-OFDM	Vidya K., Shankar kumar K.R.	2013	[31]
	Edge magnitude based multilevel thresholding	Panda R., Agrawal S., Bhuyan S.	2013	[32]
	Tsallis entropy based optimal multilevel thresholding	Agrawal S., Panda R., Bhuyan S., Panigrahi B.K.	2013	[33]
	Particle filter for Non-linear state estimation	Walia G.S., Kapoor R.	2013	[34]
	Clustering	Senthilnath J., Das V., Omkar S.N., Mani V.	2013	[35]
	Supplier selection: Reliability based total cost of ownership	Kanagaraj, G., Ponnambalam, S.G., Jawahar, N.	2012	[39]
	Bloom filter optimization	Natarajan, A., Subramanian, S.	2012	[40]
	A novel strategy of biomimicry	Goel, S., Sharma, A., Bedi, P.	2011	[41]
	Energy efficient cluster formation in wireless sensor networks	Dhivya, M., Sundarambal, M., Vincent, J.O.	2011	[42]
	Path optimization for software testing	Srivastava, P.R., Chis, M., Deb, S., Yang, XS.	2011	[43]
	Design optimization for reliable embedded system	Kumar, A., Chakarverty, S.	2011	[44]
	Data clustering	Manikandan P., Selvarajan S.	2013	[45]
	Inverse problems and topology optimization	Yang, XS., Deb, S.	2013	[46]
	Business optimization applications	Yang, XS., Deb, S., Karamanoglu, M., He, X.	2012	[47]
	Inverse problems and simulated-driven shape optimization	Yang, XS.	2012	[49]
	Solving the problem of optimum synthesis of a six-bar double dwell linkage	Bulatovi, R.R., Dordevi, S.R., Dordevi, V.S.	2013	[53]
	Optimizing the semantic web service composition process	Chifu, V.R., Pop, C.B., Salomie, I., Suia, D.S., Niculici, A.N.	2011	[54]
	Multimodal function optimization	Jamil, M., Zepernick, HJ.	2013	[55]
	Training spiking neural models	Vazquez, R.A.	2011	[57]
Engineering	Weighted sum optimization for linear antenna array	Abdul Rani, K.N., Hoon, W.F., Abd Malek, M.F.,	2012	[10]
0 11 0	synthesis	Mohd Affendi, N.A., Mohamed, L., Saudin, N., Ali, A., Neoh, S.C.		
	Structural damage identification of bridge erecting machine	Wang, L., Yang, S., Zhao, W.	2013	[15]
	Energy conscious clustering of Wireless Sensor Network	Karthikeyan, M., Venkatalakshmi, K.	2012	[19]
	Solving runway dependent aircraft landing problem	Zheng, H., Zhou, Y., Guo, P.	2013	[22]
	UCAV path planning	Wang, G., Guo, L., Duan, H., Liu, L., Wang, H., Wang, J.	2012	[23]
	Back-	Nawi, N.M., Khan, A., Rehman, M.Z.	2013	[25]

Area	Applications	Authors	Year	Ref
	propagation neural network			
	Optimization of scaling factors in electrocardiogram	Dey N., Samanta S., Yang XS., Das A., Chaudhuri	2013	[30]
	signal watermarking	S.S.		
	Expedition of groundwater exploration	Gupta D., Das B., Panchal V.K.	2013	[36]
	Scheduling optimization of flexible manufacturing	Burnwal S., Deb S.	2013	[37]
	system			
	An efficient algorithm for gray level image enhancement	Agrawal, S., Panda, R.	2012	[38]
	Symmetric linear antenna array geometry synthesis	Rani, K.N.A., Malek, F.	2011	[50]
	Flood forecasting	Chaowanawatee, K., Heednacram, A.	2012	[52]
	The selection of optimal machining parameters in milling operations	Yildiz, A.R.	2013	[56]
	Real-world simulation-based manufacturing optimization	Syberfeldt, A., Lidberg, S.	2012	[58]
	Design optimization of truss structures	Gandomi, A.H., Talatahari, S., Yang, XS., Deb, S.	2013	[59]
	Optimization of antenna arrays	Khodier, M.	2013	[60]
	Optimum design of steel frames	Kaveh, A., Bakhshpoori, T.	2013	[61]
	Side lobe suppression in a symmetric linear antenna array		2012	[62]
	A new approach for DG allocation in distribution	Moravej, Z., Akhlaghi, A.	2012	[63]
	network with time variable loads	1101u v j, 2., 1 kiliugiii, 11.	2012	[05]
Mathematics	RBF neural network	Chaowanawatee, K., Heednacram, A.	2013	[11]
Tradition across	Knapsack problems	Layeb, A.	2011	[14]
	A new gradient free optimization algorithm	Walton, S., Hassan, O., Morgan, K., Brown, M.R.	2011	[16]
	A cooperative co-evolutionary cuckoo search algorithm	Zheng, H., Zhou, Y.	2013	[28]
	for optimization problem	211018, 111, 21104, 11	2015	[=0]
	Engineering optimization	Yang, XS., Deb, S.	2010	[64]
	Determining optimal link capacity expansions in road	Baskan, O.	2013	[65]
	networks	Duskun, O.	2013	[05]
	Parameter estimation of photovoltaic models	Ma, J., Ting, T.O., Man, K.L., Zhang, N., Guan, S	2013	[66]
	Turdineter estimation of photo-volute models	U., Wong, P.W.H.	2013	[oo]
Energy	Optimal DG allocation in a smart distribution grid	Buaklee, W., Hongesombut, K.	2013	[51]
Energy	A soft computing MPPT for PV system	Ahmed, J., Salam, Z.	2013	[67]
	Parameters optimization of support vector machine	Ye, Z., Li, Q., Wang, C., Liu, W., Chen, H.	2013	[68]
	Allocation and sizing of DG	Tan, W.S., Hassan, M.Y., Majid, M.S., Rahman,	2012	[69]
	Anocation and sizing of Do	H.A.	2012	[07]
Physics and	Parameter estimation for chaotic systems	Li, XT., Yin, MH.	2012	[29]
Astronomy	Numerical function optimization	Ong, P., Zainuddin, Z.	2012	[70]
Multi-	Medical image retrieval system	Jaganathan, Y., Vennila, I.	2013	[3]
disciplinary	A new approach for solving the unit commitment	Gharegozi, A., Jahani, R.	2013	[71]
uiscipiinary	problem	Onaregozi, A., Janani, K.	2013	[/1]

It can be clearly seen that CSA can solve real-world problems by the number of publications in various applications in the area of Computer Science, Mathematics, Energy, and Engineering. In fact the performance of CSA still can be improved through modification and hybridization. There are many enhancements introduced in the structure of CSA, and the result are promising.

# Acknowledgements

The authors would like to thank Universiti Teknikal Malaysia Melaka (UTeM) and the Ministry of Higher Education (MOHE) of Malaysia for its financial support from Research Acculturation Grant Scheme (RAGS) RAGS/2013/FKE/TK02/03/B00026 for sponsoring the resources for this research.

# References

- [1] Gandomi, A.H., Yang, X.-S., Alavi, A.H., "Cuckoo search algorithm: A metaheuristic approach to solve structural optimization problems," Engineering with Computers, 2013, pp 17-35.
- [2] Zhou, Y., Zheng, H., Luo, Q., Wu, J."An improved cuckoo search algorithm for solving planar graph coloring problem," Applied Mathematics and Information Sciences, 2013, pp 785-792.
- [3] Jaganathan, Y., Vennila, I.,"An integrated framework based on

- texture features, cuckoo search and relevance vector machine for medical image retrieval system," American Journal of Applied Sciences, 2013, pp 1398-1412.
- [4] Zheng, H., Luo, Q., Zhou, Y., "A novel hybrid Cuckoo Search algorithm based on simplex operator," International Journal of Digital Content Technology and its Applications, 2012, pp 45-52.
- [5] Zhang, Y., Wang, L., Wu, Q., "Modified Adaptive Cuckoo Search (MACS) algorithm and formal description for global optimisation," International Journal of Computer Applications in Technology, 2012, pp 73-79.
- [6] Zheng, H., Zhou, Y., He, S., Ouyang, X.,"A discrete cuckoo search algorithm for solving knapsack problems," Advances in Information Sciences and Service Sciences, 2012, PP 331-339
- [7] Zhao, P., Li, H.,"Opposition-based cuckoo search algorithm for optimization problems," Proceedings - 2012 5th International Symposium on Computational Intelligence and Design, ISCID, 2012, PP 344-347.
- [8] Ouyang, X., Zhou, Y., Luo, Q., Chen, H., "A novel discrete cuckoo search algorithm for spherical traveling salesman problem," Applied Mathematics and Information Sciences, 2013, pp. 777-784
- pp 777-784.

  [9] Yang, X.-S., Deb, S., "Multiobjective cuckoo search for design optimization," Computers and Operations Research, 2013, pp 1616-1624.
- [10] Abdul Rani, K.N., Hoon, W.F., Abd Malek, M.F., Mohd Affendi, N.A., Mohamed, L., Saudin, N., Ali, A., Neoh, S.C.,"Modified cuckoo search algorithm in weighted sum optimization for linear antenna array synthesis," IEEE Symposium on Wireless Technology and Applications, 2012, pp 210-215.
- [11] Chaowanawatee, K., Heednacram, A., "Improved cuckoo search in RBF neural network with gaussian distribution," Proceedings of the 8th IASTED International Conference on Advances in Computer Science, ACS, 2013, pp 379-386.

Copyright © 2014 Praise Worthy Prize S.r.l. - All rights reserved

- [12] Saelim, A., Rasmequan, S., Kulkasem, P., Chinnasarn, K., Rodtook, A.,"Migration planning using modified Cuckoo Search Algorithm," 13th International Symposium on Communications and Information Technologies: Communication and Information Technology for New Life Style Beyond the Cloud, ISCIT, 2013, pp 621-626.
- [13] Tuba, M., Subotic, M., Stanarevic, N., "Performance of a modified cuckoo search algorithm for unconstrained optimization problems," WSEAS Transactions on Systems, 2012, pp 62-74.
- problems," WSEAS Transactions on Systems, 2012, pp 62-74.
  [14] Layeb, A.,"A novel quantum inspired cuckoo search for knapsack problems," International Journal of Bio-Inspired Computation, 2012, pp 297-305.
- [15] Wang, L., Yang, S., Zhao, W., "Structural damage identification of bridge erecting machine based on improved Cuckoo search algorithm," Beijing Jiaotong Daxue Xuebao/Journal of Beijing Jiaotong University, 2013, pp 168-173.
- [16] Walton, S., Hassan, O., Morgan, K., Brown, M.R., "Modified cuckoo search: A new gradient free optimisation algorithm," Chaos, Solitons and Fractals, 2011, pp 710-718
- [17] Kanagaraj G., Ponnambalam S.G., Jawahar N., "A hybrid cuckoo search and genetic algorithm for reliability-redundancy allocation problems," Computers and Industrial Engineering, 2013, pp 1115-1124.
- [18] Babukarthik R.G., Raju R., Dhavachelvan P., "Hybrid algorithm for job scheduling: Combining the benefits of ACO and Cuckoo search," Advances in Intelligent Systems and Computing, 2013, pp 479-490.
- [19] Karthikeyan, M., Venkatalakshmi, K., "Energy conscious clustering of Wireless Sensor Network using PSO incorporated cuckoo search," 3rd International Conference on Computing, Communication and Networking Technologies, ICCCNT, 2012
- [20] Chandrasekaran, K., Simon, S.P., "Multi-objective scheduling problem: Hybrid approach using fuzzy assisted cuckoo search algorithm," Swarm and Evolutionary Computation, 2012, pp 1-16
- [21] Srivastava, P.R., Khandelwal, R., Khandelwal, S., Kumar, S., Ranganatha, S.S., "Automated test data generation using cuckoo search and tabu search (CSTS) algorithm," Journal of Intelligent Systems, 2012, pp 195-224.
- [22] Zheng, H., Zhou, Y., Guo, P., "Hybrid genetic-cuckoo search algorithm for solving runway dependent aircraft landing problem," Research Journal of Applied Sciences, Engineering and Technology, 2013, pp 2136-2140
- [23] Wang, G., Guo, L., Duan, H., Liu, L., Wang, H., Wang, J.,"A hybrid meta-heuristic DE/CS Algorithm for UCAV path planning," Journal of Information and Computational Science, 2012, pp 4811-4818
- [24] Zheng, H., Zhou, Y.,"A novel Cuckoo Search optimization algorithm base on gauss distribution," Journal of Computational Information Systems, 2012, pp 4193-4200.
- [25] Nawi, N.M., Khan, A., Rehman, M.Z.,"A new back-propagation neural network optimized with cuckoo search algorithm," Lecture Notes in Computer Science, 2013, pp413-426.
- [26] Nawi, N.M., Khan, A., Rehman, M.Z.,"A new Cuckoo Search Based Levenberg-Marquardt (CSLM) algorithm," Lecture Notes in Computer Science, 2013, pp 438-451
- [27] Kavousi-Fard, A., Kavousi-Fard, F.,"A new hybrid correction method for short-term load forecasting based on ARIMA, SVR and CSA," Journal of Experimental and Theoretical Artificial Intelligence, 2013, pp 559-574.
- [28] Zheng, H., Zhou, Y., "A cooperative coevolutionary cuckoo search algorithm for optimization problem," Journal of Applied Mathematics. 2013.
- [29] Li, X.-T., Yin, M.-H., "Parameter estimation for chaotic systems using the cuckoo search algorithm with an orthogonal learning method," Chinese Physics B, 2012.
- [30] Dey N., Samanta S., Yang X.-S., Das A., Chaudhuri S.S., "Optimisation of scaling factors in electrocardiogram signal watermarking using cuckoo search," International Journal of Bio-Inspired Computation, 2013, pp 315-326.
- [31] Vidya K., Shankar Kumar K.R., "Channel estimation of MIMO-OFDM using cuckoo search algorithm," Journal of Theoretical and Applied Information Technology, 2013, pp 260-272.

- [32] Panda R., Agrawal S., Bhuyan S., "Edge magnitude based multilevel thresholding using Cuckoo search technique," Expert Systems with Applications, 2013, pp 7617-7628.
- [33] Agrawal S., Panda R., Bhuyan S., Panigrahi B.K.,"Tsallis entropy based optimal multilevel thresholding using cuckoo search algorithm," Swarm and Evolutionary Computation, 2013, pp 16-30
- [34] Walia G.S., Kapoor R., "Particle filter based on cuckoo search for Non-linear state estimation," Proceedings of the 2013 3rd IEEE International Advance Computing Conference, IACC, 2013, pp 918-924.
- [35] Senthilnath J., Das V., Omkar S.N., Mani V., "Clustering using levy flight cuckoo search," Advances in Intelligent Systems and Computing, 2013, pp 65-75.
- [36] Gupta D., Das B., Panchal V.K., "Applying case based reasoning in Cuckoo search for the expedition of groundwater exploration," Advances in Intelligent Systems and Computing, 2013, pp 341-353
- [37] Burnwal S., Deb S., "Scheduling optimization of flexible manufacturing system using cuckoo search-based approach," International Journal of Advanced Manufacturing Technology, 2013, pp 951-959.
- [38] Agrawal, S., Panda, R.,"An efficient algorithm for gray level image enhancement using cuckoo search" Lecture Notes in Computer Science, 2012, pp 82-89.
- [39] Kanagaraj, G., Ponnambalam, S.G., Jawahar, N.,"Supplier selection: Reliability based total cost of ownership approach using Cuckoo search," Communications in Computer and Information Science, 2012, pp 491-501.
- [40] Natarajan, A., Subramanian, S., "Bloom filter optimization using Cuckoo Search," International Conference on Computer Communication and Informatics, ICCCI, 2012.
- [41] Goel, S., Sharma, A., Bedi, P.,"Cuckoo search clustering algorithm: A novel strategy of biomimicry," Proceedings of the 2011 World Congress on Information and Communication Technologies, WICT, 2011, pp 916-921.
- [42] Dhivya, M., Sundarambal, M., Vincent, J.O., "Energy efficient cluster formation in wireless sensor networks using Cuckoo Search," Lecture Notes in Computer Science, 2011, pp 140-147.
- [43] Srivastava, P.R., Chis, M., Deb, S., Yang, X.-S.,"Path optimization for software testing: An intelligent approach using cuckoo search," Proceedings of the 5th Indian International Conference on Artificial Intelligence, IICAI, 2011, pp 725-732
- [44] Kumar, A., Chakarverty, S.,"Design optimization for reliable embedded system using Cuckoo search," 3rd International Conference on Electronics Computer Technology, 2011, pp 264-268.
- [45] Manikandan, P., Selvarajan, S., A hybrid optimization algorithm based on cuckoo search and PSO for data clustering, (2013) International Review on Computers and Software (IRECOS), 8 (9), pp. 2278-2287.
- [46] Yang, X.-S., Deb, S., "Cuckoo search for inverse problems and topology optimization," Advances in Intelligent Systems and Computing, 2013, pp 291-295.
- [47] Yang, X.-S., Deb, S., Karamanoglu, M., He, X., "Cuckoo search for business optimization applications," National Conference on Computing and Communication Systems, NCCCS 2012 – Proceeding, 2012, pp 29-33.
- [48] Dey, N., Samanta, S., Yang, X.-S., Das, A., Chaudhuri, S.S., "Optimisation of scaling factors in electrocardiogram signal watermarking using cuckoo search," International Journal of Bio-Inspired Computation, 2013, pp 315-326.
- [49] Yang, X.-S., "Cuckoo search for inverse problems and simulateddriven shape optimization," Journal of Computational Methods in Sciences and Engineering, 2012, pp 129-137.
- [50] Rani, K.N.A., Malek, F., "Symmetric linear antenna array geometry synthesis using cuckoo search metaheuristic algorithm," 17th Asia-Pacific Conference on Communications, APCC, 2011, pp 374-379.
- [51] Buaklee, W., Hongesombut, K., "Optimal DG allocation in a smart distribution grid using Cuckoo Search algorithm," 10th International Conference on Electrical Engineering/Electronics, Computer, Telecommunications and Information Technology, ECTI-CON, 2013.

- [52] Chaowanawatee, K., Heednacram, A., "Implementation of cuckoo search in RBF neural network for flood forecasting," Proceedings - 2012 4th International Conference on Computational Intelligence, Communication Systems and Networks, 2012, pp 22-26
- [53] Bulatovi, R.R., Dordevi, S.R., Dordevi, V.S., "Cuckoo Search algorithm: A metaheuristic approach to solving the problem of optimum synthesis of a six-bar double dwell linkage," Mechanism and Machine Theory, 2013, pp 1- 13.
- [54] Chifu, V.R., Pop, C.B., Salomie, I., Suia, D.S., Niculici, A.N., "Optimizing the semantic web service composition process using Cuckoo Search," Studies in Computational Intelligence, 2011, PP 93-102.
- [55] Jamil, M., Zepernick, H.-J.,"Multimodal function optimisation with cuckoo search algorithm," International Journal of Bio-Inspired Computation, 2013, pp 73-83.
- [56] Yildiz, A.R., "Cuckoo search algorithm for the selection of optimal machining parameters in milling operations," International Journal of Advanced Manufacturing Technology, 2013, pp 55-61.
- [57] Vazquez, R.A., "Training spiking neural models using cuckoo search algorithm," IEEE Congress of Evolutionary Computation, CEC, 2011, pp 679-686.
- [58] Syberfeldt, A., Lidberg, S.,"Real-world simulation-based manufacturing optimization using Cuckoo Search," Proceedings -Winter Simulation Conference, 2012.
- [59] Gandomi, A.H., Talatahari, S., Yang, X.-S., Deb, S.," Design optimization of truss structures using cuckoo search algorithm," Structural Design of Tall and Special Buildings, 2013, pp 1330-1349
- [60] Khodier, M., "Optimisation of antenna arrays using the cuckoo search algorithm," IET Microwaves, Antennas and Propagation, 2013, pp 458-464.
- [61] Kaveh, A., Bakhshpoori, T.,"Optimum design of steel frames using Cuckoo Search algorithm with Levy flights," Structural Design of Tall and Special Buildings, 2013, pp 1023-1036.
- [62] Abdul Rani, K.N., Abd Malek, M.F., Siew-Chin, N., "Nature-inspired cuckoo search algorithm for side lobe suppression in a symmetric linear antenna array," Radioengineering, 2012, pp 865-874.
- [63] Moravej, Z., Akhlaghi, A., A new approach for DG allocation in distribution network with time variable loads using cuckoo search, (2012) *International Review of Electrical Engineering* (IREE), 7 (2), pp. 4027-4034.
- [64] Yang, X.-S., Deb, S., "Engineering optimisation by cuckoo search," International Journal of Mathematical Modelling and Numerical Optimisation, 2010, pp 330-343.
- [65] Baskan, O.,"Determining optimal link capacity expansions in road networks using cuckoo search algorithm with Levy flights," Journal of Applied Mathematics, 2013.
- [66] Ma, J., Ting, T.O., Man, K.L., Zhang, N., Guan, S.-U., Wong, P.W.H., "Parameter estimation of photovoltaic models via cuckoo search," Journal of Applied Mathematics, 2013.
- [67] Ahmed, J., Salam, Z. "A soft computing MPPT for PV system based on Cuckoo Search algorithm," International Conference on Power Engineering, Energy and Electrical Drives, 2013, pp 558-562
- [68] Ye, Z., Li, Q., Wang, C., Liu, W., Chen, H., "Parameters optimization of support vector machine using energy-saving cuckoo search," Energy Education Science and Technology Part A: Energy Science and Research, 2013, pp 949-954.
- [69] Tan, W.S., Hassan, M.Y., Majid, M.S., Rahman, H.A., "Allocation and sizing of DG using Cuckoo Search algorithm," IEEE International Conference on Power and Energy, 2012, pp 133-138
- [70] Ong, P., Zainuddin, Z., "An efficient cuckoo search algorithm for numerical function optimization," AIP Conference Proceedings, 2013, pp 1378-1384.
- [71] Gharegozi, A., Jahani, R.,"A new approach for solving the unit commitment problem by cuckoo search algorithm," Indian Journal of Science and Technology, 2013, pp 5235-5241.

#### **Authors' information**



Ezreen Farina Shair was born in Selangor, Malaysia in 1987. She received her B.Eng degree in Control and Instrumentation engineering from Universiti Teknologi Malaysia (UTM), in 2009. She received her M.Eng degree in Mechatronics and Automatic Control engineering also from UTM, in 2012. Currently, she is a Lecturer at Universiti Teknikal Malaysia

Melaka (UTeM) and her interests are in Control System and Digital Signal Processing.



**Shen Yang Khor** is a final year student at Universiti Teknikal Malaysia Melaka (UTeM). He is currently pursuing his degree in Electrical Engineering – Power Electronics and Drives. His final year project focuses on optimization techniques under the supervision of Ms. Ezreen Farina Shair.



Dr. Abdul Rahim Abdullah was born in Kedah, Malaysia in 1979. He received his B. Eng, Master and PhD Degree from University of Technology Malaysia (UTM) in 2001, 2004 and 2011 in Electrical Engineering and Digital Signal Processing. He is currently a Senior Lecturer at Universiti Teknikal Malaysia Melaka (UTeM) and his interests is in digital signal

processing.



Hazriq Izzuan Jaafar received his B.Eng degree in Electrical Engineering from Universiti Teknologi Malaysia (UTM), in 2008. He received the M.Eng degree in Mechatronics and Automatic Control engineering also from UTM, in 2013. Currently, he is a Lecturer at Universiti Teknikal Malaysia Melaka (UTeM) and his interests are in control system and optimization

techniques.



Nursabillilah Mohd Ali is a lecturer at the Mechatronic Engineering Department in Universiti Teknikal Malaysia Melaka (UTeM). She received her Master of Science in Mechatronic Engineering in 2013 from International Islamic University Malaysia (IIUM). She obtained her B.Eng. degree in Mechatronic Engineering (Hons.) and Diploma

in Electronic Engineering respectively in 2009 and 2006 from Universiti Teknikal Malaysia Melaka (UTeM).



Amar Faiz Zainal Abidin received his Bachelor of Engineering in Electrical & Electronics from University of Nottingham in 2008. While working as Tutor in Universiti Teknologi Malaysia (UTM), he completed his master degrees: Master of Engineering in Electrical (Mechatronics & Automatic Control) from UTM and Master of Science in Computer

Vision from University of Burgundy. Currently, he serves Faculty of Electrical Engineering, Universiti Teknologi MARA (Pasir Gudang) as a Lecturer and his main research interest is in Computational Intelligence.