# Fuzzy-Controller for Handover in Mobile Networks

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*Abstract*— In the paper it is proposed to use a fuzzycontroller in mobile networks for improving the handover process. An architecture of the fuzzy-controller was developed. Linguistic variables, terms and membership functions for input and output values were defined. A rules base was developed. The operation of the fuzzy-controller was simulated.

Keywords—fuzzy; mobile; handover

#### I. INTRODUCTION

The modern mobile systems must be able to support integrated services applications and guarantee all requirements for quality-of-service.

The handover in mobile systems is a quite essential operation. Handover is the process of changing the channel while a call is being served. It is initiated either when crossing a cell boundary or when a quality of the signal in the channel reduces. Performance of the handover mechanism is important to maintain the appropriate Quality of Service (QoS) . So, new and better handover algorithms are required to keep QoS as high as possible. It is necessary to provide that handover should be performed reliably and without disruption of calls.

The conventional handover algorithm compares the received signal strength (RSS) of the serving base station with those of the other base stations and selects the base station with the strongest received signal. However, some other metrics to support handover decisions are to be used for increasing the mobile system efficiency.

Handover algorithms, based on soft computing techniques such as fuzzy logic, neural networks and genetic algorithms can be used for that purpose[1-6].

Fuzzy systems, neural networks, and genetic algorithms have replaced conventional techniques in many engineering applications, especially in control systems [7-9]. In modern telecommunication networks, the soft-computing-based control techniques [10-22] are widely used.

Fuzzy logic refers to a logical system that generalizes classical logic for reasoning under uncertainty. In general sense, fuzzy logic refers to all the theories and techniques employing fuzzy sets, i.e. classes with rough confines. Fuzzy logic implements human experiences by means of membership functions and fuzzy rules. Fuzzy logic can be used when dealing with uncertain information while a network shows dynamic nature [23-25].

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Artificial neural networks are physical cellular systems which can acquire, store and utilize experiential knowledge. One may say that they function as parallel distributed computing networks. But, they are not programmed to perform specific task, they to be taught, or trained. Also, they can learn new associations and patterns. Neural networks can change their weights to optimize their work.

Genetic algorithm is an optimization technique of iterative search and finding solutions to problems by a process based on natural selection, mutation, crossover and reproduction. Genetic algorithms are successfully used to solve many combinatorial optimization problems.

Hybrid systems combining fuzzy logic, neural networks, and genetic algorithms have proved their effectiveness in a wide variety of problems [26-28].

So, the purpose of this paper is to develop a fuzzy logic based handover controller.

## II. ARCHITECTURE OF THE FUZZY-CONTROLLER

Generally, a fuzzy controller consists of four main blocks: a fuzzifier, defuzzifier, inference engine, and fuzzy rule base. The fuzzifier transforms each input variable to the membership functions values. The inference engine calculates the fuzzy output depending on the rule base. The defuzzifier converts the fuzzy output to crisp value using mathematical formulas.

After having studied the problem of designing a fuzzycontroller [29-32], we propose to use in mobile networks a fuzzy-controller having three input and one output linguistic variables (fig.1). Input linguistic variables of the fuzzycontroller are a bit error rate (BER) [33], a received signal strength indicator (RSSI), and a load in the cell, its output variable is a handover indicator.

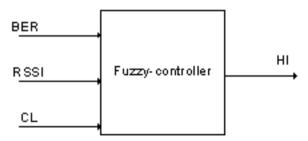


Fig. 1. The architecture of the fuzzy-controller

For defining bit error rate (BER) terms "low", "moderate", and "high" are used. Thus, the term set of BER is:

 $T(BER) = \{Low (L), Medium (M), High (H)\}.$ 

Membership functions for T(BER) are presented on fig. 2.

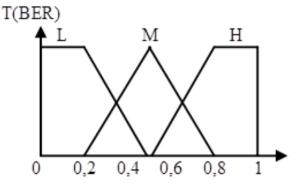


Fig. 2. Membership functions for the BER linguistic variable

For defining the received signal strength indicator RSSI terms "weak", 'medium" and "strong" are used. Thus, the term set of RSSI is:

T(RSSI)={Weak (W), Medium (M), Strong (S)}.

Membership functions for T(RSSI) are presented on fig. 3.

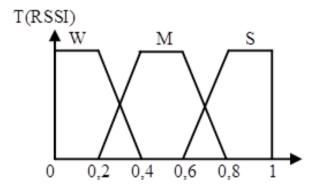


Fig. 3. Membership functions for the RSSI linguistic variable

For defining the cell load (CL) terms "small", "medium", and "big" are used. Thus, the term set of CL is:

 $T(CL) = \{ Small (L), Medium (M), Big (B) \}.$ 

Membership functions for T(CL) are presented on fig. 4.

For defining the handover indicator (HI) terms "no handover", "wait", "ready" and "handover" are used. Thus, the term set of HI is:

T(HI)={No (N), Wait (W), Ready (R) Handover (H)}.

Membership functions for T(HI) are presented on fig. 5.

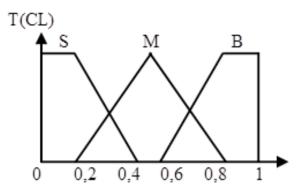


Fig. 4. Membership functions for the CL linguistic variable

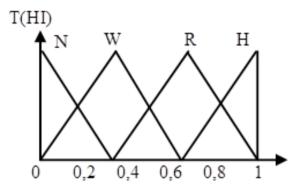


Fig. 5. Membership functions for the HI linguistic variable

### III. RULES OF THE FUZZY-CONTROLLER

The proposed fuzzy-controller works according to a rule base consisting of twenty-seven rules:

If BER=L and RSSI=W and CL=S than H=W;

If BER=L and RSSI=W and CL=M than H=W;

If BER=L and RSSI=W and CL=B than H=W;

If BER=L and RSSI=M and CL=S than H=N;

If BER=L and RSSI=M and CL=M than H=N;

If BER=L and RSSI=M and CL=B than H=W;

If BER=L and RSSI=S and CL=S than H=N;

If BER=L and RSSI=S and CL=M than H=N;

If BER=L and RSSI=S and CL=B than H=N;

If BER=M and RSSI=W and CL=S than H=R;

If BER=M and RSSI=W and CL=M than H=R;

If BER=M and RSSI=W and CL=B than H=R;

If BER=M and RSSI=M and CL=S than H=W;

If BER=M and RSSI=M and CL=M than H=W;

If BER=M and RSSI=M and CL=B than H=R;

If BER=M and RSSI=S and CL=S than H=W;

If BER=M and RSSI=S and CL=M than H=W;

If BER=M and RSSI=S and CL=B than H=W;

If BER=H and RSSI=W and CL=S than H=H;

If BER=H and RSSI=W and CL=M than H=H;

If BER=H and RSSI=W and CL=B than H=H;

If BER=H and RSSI=M and CL=S than H=R;

If BER=H and RSSI=M and CL=M than H=H;

If BER=H and RSSI=M and CL=B than H=H;

If BER=H and RSSI=S and CL=S than H=R;

If BER=H and RSSI=S and CL=M than H=R;

If BER=H and RSSI=S and CL=B than H=R.

## IV. OPERATION OF THE FUZZY-CONTROLLER

The proposed fuzzy-controller acts as follows.

In the fuzzyfier each input variable gets a corresponding fuzzy value:

$$BER \Rightarrow BER_L, BER_M, BER_H;$$

$$RSSI \Rightarrow RSSI_{W}, RSSI_{M}, RSSI_{S};$$

$$CL \Rightarrow CL_S, CL_M, CL_B.$$

Then in the inference engine the minimum operations are performed:

$$w_1 = \min[BER_L, RSSI_W, CL_S],$$

$$w_2 = \min[BER_L, RSSI_W, CL_M],$$

 $w_{27} = \min[BER_H, RSSI_S, CL_B].$ 

...

In the defuzzyfier the crisp value is obtained:

$$HI = \frac{\sum_{i=1}^{27} w_1 \cdot HI_1}{\sum_{i=1}^{27} w_1}.$$

## V. SIMULATION

In order to confirm the operability of the fuzzy-controller we can use the Matlab 6.5 program. It is a multi-paradigm numerical computing environment and fourth-generation programming language. The simulated fuzzy-controller is shown on fig.6.

Specifying the bit error rate input linguistic variable is shown on fig.7.

Specifying the received signal strength indicator input linguistic variable is shown on fig.8.

Specifying the cell load input linguistic variable is shown on fig.9

Specifying the handover indicator output linguistic variable is shown on fig.10.

Specifying the rule base is shown on fig.11.

The rule surfaces are shown on fig.12–14.

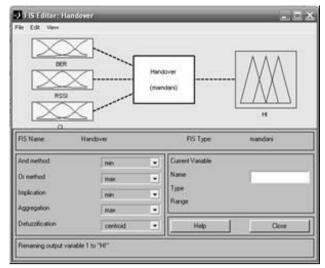


Fig. 6. The fuzzy-controller in Matlab 6.5

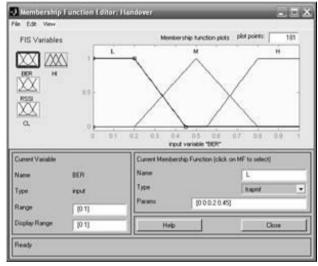


Fig. 7. Specifying the BER input variable

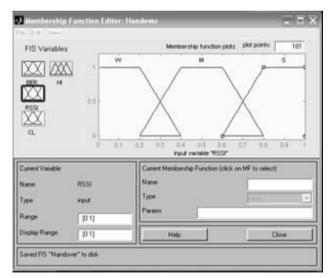


Fig. 8. Specifying the RSSI input variable

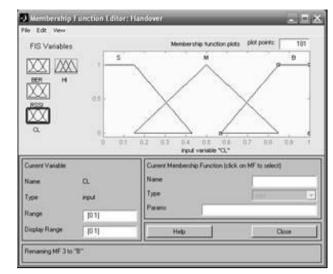


Fig. 9. Specifying the CL input variable

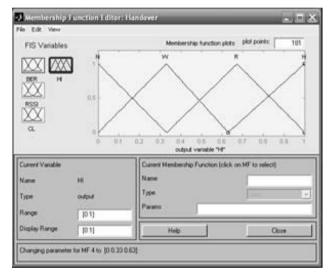


Fig. 10. Specifying the HI output variable

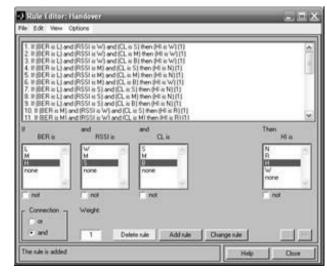


Fig. 11. The rule base

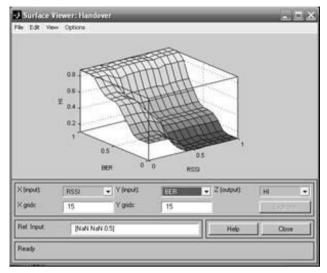


Fig. 12. The rule surface, RSSI–BER–HI

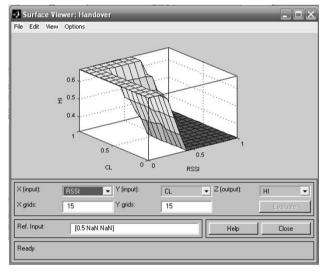


Fig. 13. The rule surface, RSSI–CL–HI

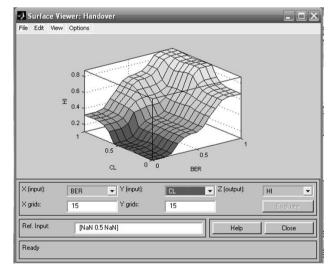


Fig. 14. The rule surface, BER-CL-HI

Let the bit error rate BER=0.5, the received signal strength indicator RSSI=0.5, and the cell load CL=0.5. According to fig. 15, we get the handover indicator value HI=0.32.

Rule Viewer: Hand File Edit View Options	over	_	
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Fig. 15. The simulation result giving HI=0.32

Let the bit error rate BER=0.25, the received signal strength indicator RSSI=0.5, and the cell load CL=0.75. According to fig. 16, we get the handover indicator value HI=0.389.

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Fig. 16. The simulation result giving HI=0.389

Let the bit error rate BER=0.6, the received signal strength indicator RSSI=0.7, and the cell load CL=0.75. According to fig. 17, we get the handover indicator value HI=0.509.

Let the bit error rate BER=0.5, the received signal strength indicator RSSI=0.1, and the cell load CL=0.9. According to fig. 18, we get the handover indicator value HI=0.669.

Let the bit error rate BER=0.8, the received signal strength indicator RSSI=0.1, and the cell load CL=0.6. According to fig. 19, we get the handover indicator value HI=0.872.

Let the bit error rate BER=0.8, the received signal strength indicator RSSI=0.05, and the cell load CL=0.5. According to fig. 20, we get the handover indicator value HI=0.88.

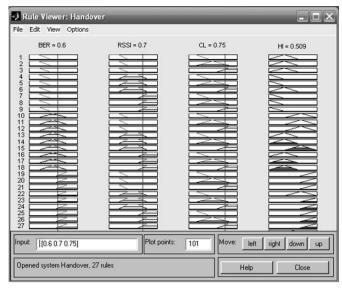


Fig. 17. The simulation result giving HI=0.509

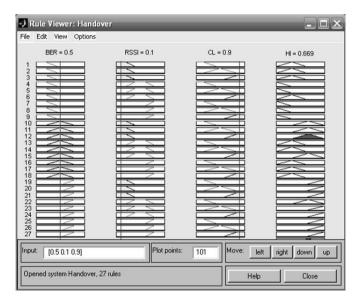


Fig. 18. The simulation result giving HI=0.669

So, according to the simulation results, the proposed handover fuzzy-controller can be applied in mobile communication systems.

The application of the fuzzy-controller can improve the process of base station selection and unnecessary handovers avoiding.

The proposed fuzzy-controller can be improved by considering some other parameters.

In future works, handover mechanism is to be optimized by combining the multicriterial method with other soft computing techniques such as neural networks and genetic algorithms.

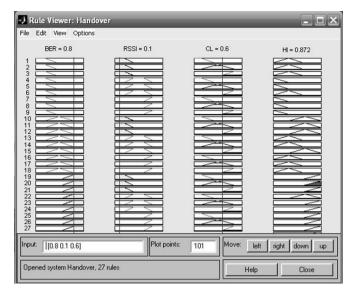


Fig. 19. The simulation result giving HI=0.872

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BER = 0.8	RSSI = 0.05	CL = 0.5	H# = 0.88
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Fig. 20. The simulation result giving HI=0.88

### VI. CONCLUSION

In mobile networks the procedure of handover is necessary for maintaining the communication quality. However, it is rather complex to make handover decision in mobile networks because multiple criteria should be considered. So, in this work the fuzzy-controller for mobile networks with several criteria in addition to RSSI was developed to improve the handover decision process: the first one is a bit error rate and the second one is a load in the cell. The proposed handover technique is well suited for high-speed applications.

#### REFERENCES

 Thiyagarajan S. Fuzzy Normalized Handoff Initiation Algorithm For Heterogeneous Networks / Sivakami Thiyagarajan, Shanmugavel Sedhu // International Journal of Hybrid Information Technology. – Vol.7. – No.5. – 2014. – pp.155-166.

- [2] Lim J. Smart Handover Based on Fuzzy Logic Trend in IEEE802.11 Mobile IPV6 Networks / Joanne Mun-Yee Lim, Chee-Onn Chow // International Journal of Wireless & Mobile Networks (IJWMN). – Vol. 4. – No. 2. – April 2012. – pp.217-234.
- [3] Sharma M. Fuzzy logic based handover decision system / Manoj Sharma, R.K.Khola // International Journal of Ad hoc, Sensor & Ubiquitous Computing. – 2012. – Vol. 3, №.4. – P. 21–29.
- [4] Werner Ch. Handover Parameter Optimization in WCDMA Using Fuzzy Controlling / Christina Werner, Jens Voigt, Shahid Khattak, Gerhard Fettweis // The 18th Annual IEEE International Symposium on Personal, Indoor and Mobile Radio Communications (PIMRC'07). – Athens. – 3-7 Sept. 2007.
- [5] Yang K. An Adaptive Soft Handover Scheme Using Fuzzy Load Balancing for WCDMA Systems / Kemeng Yang, Bin Qiu and Laurence S. Dooley // International Conference on Networks and Communication Systems (NCS '06), 29 - 31 Mar 2006, Chiang Mai, Thailand.
- [6] Sachdeva M. A Survey of Handoff Strategy and Fuzzy Logic with Desired Quality of Service / Manish Sachdeva, Pankaj Kumar // International Journal of Innovative Science, Engineering & Technology, Vol. 2 Issue 10, October 2015. – pp. 316-319.
- [7] Jagielska I. An investigation into the application of neural networks, fuzzy logic, genetic algorithms, and rough sets to automated knowledge acquisition for classification problems/ Ilona Jagielska, Chris Matthews, Tim Whitfort // Neurocomputing. – vol. 24. – №. 3. – 1999 – pp. 37-54.
- [8] Koskie S. Optimal SIR-based power control strategies for wireless CDMA networks / S. Koskie, Z. Gajic // International journal of information and systems sciences. – vol. 4. – №. 2. – 2008 – pp. 204-218.
- [9] Sanmugapriyaa K. Intelligent Closed Loop Power Control For Reverse Link CDMA System Using Fuzzy Logic System / K.Sanmugapriyaa, P.Padmaloshani // International Journal of Scientific and Engineering Research. – vol. 6. – №. 4. – 2015 – pp. 258-263.
- [10] Atayero A. A. Applications of Soft Computing in Mobile and Wireless Communications / Atayero A. A., Luka M. K. // International Journal of Computer Applications. – Vol. 45. – №. 22. – 2012. – Pp. 48-54.
- [11] I-Shyan Hwang, Bor-Jiunn Hwang, K. Robert Lai, Ling-Feng Ku, Chien-Chieh Hwang. Adaptive QoS-aware Resource Management in Heterogeneous Wireless Networks // Proc of the 22nd International Conference on Advanced Information Networking and Applications. – 2008. – P. 880–805.
- [12] Kejík P. Fuzzy logic based call admission control in UMTS system / Petr Kejik, Stanislav Hanus // Proceedings of the 2009 1st International Conference on Wireless Communication, Vehicular Technology, Information Theory and Aerospace & Electronic System Technology. Aalborg (Denmark), 2009, p. 375-378.
- [13] Anecia C. M. FACM: Fuzzy Based Resource Admission Control For Multipath Routing in MANET / Anecia C. M., Pushpalatha M. S. // International Journal of Advanced Research in Computer Science & Technology (IJARCST 2014) – Vol. 2. – 2014. – pp. 114-119.
- [14] Chandra R. N. S. Call admission control in mobile cellular CDMA systems using fuzzy associative memory / Rupenaguntla Naga Satish Chandra, Dilip Sarkar // Proceedings of the International Conference on Computer Communications and Networks - ICCCN, 2004.
- [15] Todinca D. Fuzzy logic based admission control for GPRS/EGPRS Networks / Doru Todinca, Stefan Holban, Philip Perry, John Murphy // Trans. on Automatic Control & Control Science, Vol. 4, pp. 205-210, Timisoara, Romania, May 2004.
- [16] Ardalani N. Comparison of Adaline and MLP Neural Networkbased Predictors in SIR Estimation in Mobile DS/CDMA Systems / N. Ardalani, Ah. Khoogar, H. Roohi // International Journal of Electrical, Computer, Energetic, Electronic and Communication Engineering. – vol. 1. – № 9. – 2007 – pp. 1382-1387.
- [17] Zhou J. Optimization of Dynamic Allocation of Transmitter Power in a DS-CDMA Cellular System Using Genetic Algorithms / J. Zhou, Y. Shiraishi, U. Yamamoto, Y. Onosato, H. Kikuchi // IEICE transactions on fundamentals of electronics, communications and computer. – vol. 84. – №. 10. – 2001 – pp. 2436-2446.

- [18] Kumar D. Performance analysis of AI based QoS scheduler for mobile WiMAX / D. David Neels Pon Kumar, K. Murugesan // ICTACT Journal on Communication Technology. – 2012. – Vol. 3, №.3. – P. 572–579.
- [19] Kumar V. B. P. Neural Networks Based Efficient Multiple Multicast Routing for Mobile Networks / Kumar V. B. P., Kumar D. S. M. // International Journal of Information and Electronics Engineering. – vol. 4. – № 2. – 2014 – pp. 145-152.
- [20] Kojic, N. New Algorithm for Packet Routing in Mobile Ad-hoc Networks / N. S. Kojic, M. B. Z. Ivancic, I. S. Reljin, B. D. Reljin // Journal of automatic control. University of Belgrade. – Vol.20. – 2010. – Pp. 9-16.
- [21] Kojić N. Route selection problem based on Hopfield neural network / N. Kojić, I. Reljin, B. Reljin // Radioengineering. – Dec, 2013. – Vol. 22. – № 4. – pp. 1182-1193.
- [22] Alandjani G. / Fuzzy routing in ad hoc networks / Alandjani G., Johnson E. E. // Proceedings of the 2003 IEEE International Performance, Computing, and Communications Conference. – 2003. – Pp. 525 - 530.
- [23] Robert Fullér. On fuzzy reasoning schemes / Robert Fullér // The State of the Art of Information Systems Applications in 2007. – Turku Centre for Computer Science, Åbo, 1999. – Vol.16. – P. 85–112.
- [24] Robert Fullér. Fuzzy logic and neural nets in intelligent systems / Robert Fullér // Information Systems Day. – Turku Centre for Computer Science, Åbo, 1999. – Vol.17. – P. 74–94.
- [25] Robert Fullér. Neural Fuzzy Systems / Robert Fullér // Abo Akademi University –1995. – 348p.
- [26] Kejík P. Comparison of Fuzzy Logic and Genetic Algorithm Based Admission Control Strategies for UMTS System / Kejík P., Hanus S. // Radioengineering. – 2010. – p. 6–10. ISSN: 1210-2512.
- [27] Access network selection based on fuzzy logic and genetic algorithms / Mohammed Alkhawlani, Aladdin Ayesh // Hindawi Publihing. Corporation Advances in Artificial Intelligence. – Vol. 8 N.1, 2008, p.1-12.
- [28] Chang Ch-J. Fuzzy/Neural congestion control for integrated voice and data DS-CDMA/FRMA cellular networks / Chung-Ju Chang, Bo-Wei Chen, Terng-Yuan Liu, Fang-Ching Ren // IEEE journal on selected areas in communications, Special Issue on Intelligent Techniques in High Speed Networks, Vol.18, N2, 2000.
- [29] Semenova O. Access fuzzy controller for CDMA networks / O. Semenova, A. Semenov, K. Koval, A. Rudyk, V. Chuhov // Proceedings of the International Siberian Conference on Control and Communications (SIBCON-2013). – Krasnoyarsk: Siberian Federal University. Russia, Krasnoyarsk, September 12–13, 2013.
- [30] Semenova O. The Fuzzy Neural Controller for CDMA Networks / O. Semenova, A. Semenov, V. Mondlyak, R. Krasota // Proceedings of the International Conference TCSET'2014 Dedicated to the 170th anniversary of Lviv Polytechnic National University. Lviv-Slavske, Ukraine, February 25 – March 1, 2014. – P. 483.
- [31] Semenova O. The fuzzy-controller for WiMAX networks / O. Semenova, A. Semenov, O. Voznyak, D. Mostoviy, I. Dudatyev // Proceedings of the International Siberian Conference on Control and Communications (SIBCON-2015). – Krasnoyarsk: Siberian Federal University. Russia, Krasnoyarsk, May 23–25, 2015.
- [32] Semenov A. Routing in Telecommunication Networks Using Fuzzy Logic / A. Semenov, O. Semenova, O. Voznyak, O. Vasilevskyi, M. Yakovlev // 17th International Conference of Young Specialists on Micro/Nanotechnologies and Electron Devices EDM 2016, Erlagol, Altai - 30 June - 4 July, 2016: Conference Proceedings, 2016. – P. 173-177.
- [33] Kychak V. Initial data processing algorithms of bit error rate testers / V. Kychak, V. Tromsyuk // Proceedings of the International Conference TCSET'2016 Dedicated to the 170th anniversary of Lviv Polytechnic National University. Lviv-Slavske, Ukraine, 23-26 Feb. 2016. – P. 566-568.