# Laboratory for Cognitive Modeling

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## **RESEARCH ACTIVITIES**

Laboratory for Cognitive Modelling (LKM) was officially founded in 2001. LKM carries out research in cognitive modelling, machine learning, neural networks, picture and data mining. Research results concern the modelling of noisy data related to cognitive, medical, biological and other processes. We are developing, testing and applying new approaches and algorithms for modelling from numeric, symbolic and pictorial data, and new approaches to building, evaluation and explanation of models, derived from data. Recent research is related to evaluating the utility of ordinal attributes, evaluating the reliability of single models' predictions in classification and regression, evaluating the reliability of clustering, explaining single predictions by arbitrary classification and regression model, text summarization using archetypal analysis, analysing and modelling of sport data, user profiling by mining the web-logs, recommendation systems, learning of imbalanced classification problems, applying evolutionary computation to data mining focused on using ant colony optimization, prediction intervals which represent the distribution of individual future points in a more informative manner, spatial data mining with multi-level directed graphs, employing background knowledge analysis for search space

reduction in inductive logic programming, detection of (non)-ischemic episodes in ECG signals, heuristic search methods in clickstream mining and mining of data streams. A notable aspect of much of this research is its application to problems in image analysis, medical diagnosis, ecological modelling, marketing and financial modelling.

## **RESEARCH PROJECTS**

Artificial Intelligence and Intelligent Systems (P2-0209). Research Programme, Slovenian Research Agency (2009-2014).

A component for intelligent analysis of data streams. Industry-Funded Project, Optilab (2012-2013).

### LABORATORY GUESTS

Prof. Dr. Zikrija Avdagić, University of Sarajevo, BIH, 27.05. 2013 – 29.5.2013. Research collaboration on using AI for lung cancer diagnosis
Dr. Aida Hajdarpašić, University of Sarajevo, BIH, 27.05. 2013 – 29.5.2013. Research collaboration on using AI for lung cancer diagnosis
Dino Kečo, MSc, University of Sarajevo, BIH, 27.05. 2013 – 29.5.2013. Research collaboration on using AI for lung cancer diagnosis
Prof. Dr. Tatjana Zrimec, Universa na Primorskem, Koper, 20. 5. 2013 - 29. 5. 2013. Research collaboration on machine learning from lung cancer image data.
Ercan Canhas, MSc, University of Prizren, Kosovo. 4. 11. 2013 - 7. 11. 2013. Research collaboration on multidocument summarization based on archetypal analysis.

#### SELECTED PUBLICATIONS

I. Kononenko, M. Kukar: Machine Learning and Data Mining: Introduction to Principles and Algorithms, Horwood publ., 2007 (454 pages).

OCEPEK, Uroš, BOSNIĆ, Zoran, NANČOVSKA ŠERBEC, Irena, RUGELJ, Jože. Exploring the relation between learning style models and preferred multimedia types. *Computers & Education*, Nov. 2013, vol. 69, pp. 343-355.

PETELIN, Boris, KONONENKO, Igor, MALAČIČ, Vlado, KUKAR, Matjaž. Multi-level association rules and directed graphs for spatial data analysis. *Expert systems with applications*, 2013, vol. 40, issue 12, pp. 4957-4970

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ROBNIK ŠIKONJA, Marko, ŠTRUMBELJ, Erik, KONONENKO, Igor. Efficiently explaining the predictions of a probabilistic radial basis function classification network. *Intelligent data analysis*, 2013, vol. 17, no. 5, pp. 791-802.

ŠTRUMBELJ, Erik, VRAČAR, Petar, ROBNIK ŠIKONJA, Marko, DEŽMAN, Brane, ERČULJ, Frane. A decade of Euroleague basketball: an analysis of trends and recent rule change effects. *Journal of Human Kinetics*, 2013, vol. 38, pp. 183-189

ŠTRUMBELJ, Erik, KONONENKO, Igor. Explaining prediction models and individual predictions with feature contributions. Knowledge and information systems, 2013, pp.1-19.

CANHASI, Ercan, <u>KONONENKO, Igor</u>. Multi-document summarization via Archetypal Analysis of the content-graph joint model. *Knowledge and information systems*, 2013, pp. 1-22. Z. Bosnić, P.Vračar, M. Radović, G. Devedžić, N. Filipović., I. Kononenko. Mining data from hemodynamic simulations for generating prediction and explanation models. *IEEE trans. inf. technol. biomed.*. Mar. 2012, vol. 16, no. 2, pp. 248-254, 1A1

- M. Robnik-Šikonja, I. Kononenko, E. Štrumbelj. Quality of classification explanations with PRBF. Neurocomputing, Nov. 2012, vol. 96, pp. 37-46, 1A2
- E. Štrumbelj, P.Vračar. Simulating a basketball match with a homogeneous Markov model and forecasting the outcome. Int. j. forecast.. 2012, vol. 28, no. 2, pp. 532-542. 1A1
- M. Kukar, I. Kononenko, C. Grošelj. Modern parameterization and explanation techniques in diagnostic decision support system: a case study in diagnostics of coronary artery disease. *Artif. intell. med.*. Jun. 2011, vol. 52, no. 2, pp. 77-90, 1A2
- E. Štrumbelj, M. Robnik-Šikonja. Online bookmakers' odds as forecasts: the case of European soccer leagues. Int. j. forecast. 2010, vol. 26, no. 3, pp. 482-488. 1A1
- E. Štrumbelj, I. Kononenko: An efficient explanation of individual classifications using game theory. J. Mach. Learn. Res. 2010, 11[1]:1-18. 1A1
- E. Štrumbelj, Z. Bosnić, I. Kononenko, B. Zakotnik, C. Grašič-Kuhar: Explanation and reliability of prediction models: the case of breast cancer recurrence. Knowledge and information systems, 24(2)305-324, 2010. 1A1



We collaborate with several Universities and Institutes from Belgium, BiH, Croatia, Czech Republic, Greece, Kosovo, Portugal, Serbia, and Spain



The book by two members of LKM was published by Horwood and represents the appreciation of our research work