

FACULTY OF ELECTRICAL  
ENGINEERING**SUBJECT CARD**

Name in Polish: **Sztuczna inteligencja w automatyce elektroenergetycznej**  
 Name in English: **Artificial intelligence in power system protection and control**  
 Main field of study (if applicable): **Industrial Control Engineering**  
 Specialization (if applicable): **Automation and Control in Electrical Power Systems**  
 Level and form of studies: **2nd level, full-time**  
 Kind of subject: **obligatory**  
 Subject code: **APR012115**  
 Group of courses: **NO**

|  | Lecture     | Classes | Laboratory | Project              | Seminar |
|--|-------------|---------|------------|----------------------|---------|
| Number of hours of organized classes in University (ZZU):                        | 30          |         |            | 15                   |         |
| Number of hours of total student workload (CNPS):                                | 120         |         |            | 30                   |         |
| Form of crediting:   | examination |         |            | crediting with grade |         |
| For group of courses mark (X) final course:                                      |             |         |            |                      |         |
| Number of ECTS points:   | 4           |         |            | 1                    |         |
| including number of ECTS points for practical (P) classes :                      |             |         |            | 1                    |         |
| including number of ECTS points for direct teacher-student contact (BK) classes: | 2.80        |         |            | 0.70                 |         |

**PREREQUISITES RELATING TO KNOWLEDGE, SKILLS AND OTHER COMPETENCES**

1. Knowledge of basics of power system control, digital signal processing and numerical methods
2. Practical skills of using MATLAB and ATP-EMTP software
3. Creativity in thinking and working

**SUBJECT OBJECTIVES**

- C1. Mastering artificial intelligence techniques and fundamentals of decision theory as related to automation and control systems
- C2. Acquiring practical skills to design and analyze control and protection units for power systems, with application of artificial intelligence techniques

**SUBJECT LEARNING OUTCOMES***relating to knowledge:*

- PEU\_W01 Possesses knowledge related to expert systems: basic features, structure, inference methods, conflict resolution strategies, application fields
- PEU\_W02 Possesses knowledge related to fuzzy logic systems: fuzzy signals, membership functions, fuzzy settings, fuzzyfication and defuzzyfication methods, realization of multi-criteria algorithms
- PEU\_W03 Possesses knowledge related to artificial neural networks (features, neurone types, activation functions, neural network structures, learning methods, application fields) as well as genetic algorithms (evolutionary strategies, genetic modifications)

*relating to skills:*

- PEU\_U01 Is able to apply expert systems for power system control and protection purposes
- PEU\_U02 Is able to apply fuzzy logic technique for power system control and protection purposes
- PEU\_U03 Is able to apply artificial neural networks and genetic algorithms for power system control and protection purposes

*relating to social competences:*

- PEU\_K01 Is able to carry out a complex engineering project in a competent way, unaided, undertaking multi-criterial analysis

## PROGRAMME CONTENT

| Form of classes - lecture |  | Number of hours: |
|---------------------------|--|------------------|
| Lec 1                     | Introduction. Setting rules of course crediting. Definition of artificial intelligence (AI), AI as a branch of science, AI techniques in power systems, statistics of AI application in power system protection and control. | 2                |
| Lec 2                     | AI approach to protection and control tasks – problems of contemporary digital protection systems, protection relay as a classifying unit, protection tasks as pattern recognition tasks.                                    | 2                |
| Lec 3                     | Expert Systems (ES) – definitions, knowledge base, data base, inference mechanisms.  | 2                |
| Lec 4                     | ES – semantic rules and structures, acquisition of rules, inference methods, conflict resolving strategies.  | 2                |
| Lec 5                     | Expert Systems – application fields, examples.   | 2                |
| Lec 6                     | Fuzzy Logic (FL) – basics of fuzzy sets theory, operations on fuzzy sets, fuzzy arithmetic.  | 2                |
| Lec 7                     | Linguistic variables, operators of aggregation, fuzzy reasoning.   | 2                |
| Lec 8                     | Elements of FL in power system protection – fuzzy criteria signals, fuzzy settings, fuzzy comparison, amount of information, multi-criterial decision making.  | 2                |
| Lec 9                     | Examples of FL technique application in power system protection.   | 2                |
| Lec 10                    | Artificial Neural Networks (ANN) – neurone models, activation functions, multilayer perceptron.  | 2                |
| Lec 11                    | ANN architectures: feed-forward networks, ANNs with feedback connections, Hopfield networks, Kohonen networks.   | 2                |
| Lec 12                    | ANN design problems – network structure selection, generation of training patterns, training algorithms with and without the teacher, learning process acceleration techniques, knowledge generalisation vs. overfitting.    | 2                |
| Lec 13                    | Examples of ANN application in power system control.   | 2                |
| Lec 14                    | Genetic algorithms – evolutionary strategies, genetic modification of individuals, genetic optimisation, application examples.   | 2                |
| Lec 15                    | Comparison of described AI techniques, hybrid structures, examples.  | 2                |
| Total hours:              |  | <b>30</b>        |

| Form of classes - project |   | Number of hours: |
|---------------------------|---|------------------|
| Proj 1                    | Design and optimization of an expert system for chosen decision task.                     | 4                |
| Proj 2                    | Design and evaluation of the fuzzy logic based measurement/decision unit.                 | 4                |
| Proj 3                    | Design and evaluation of the neural network based measurement/decision unit.              | 4                |
| Proj 4                    | Implementation of genetic optimization procedures for selected measurement/decision task. | 2                |
| Proj 5                    | Presentation of the projects performed, crediting.  | 1                |
| Total hours:              |   | <b>15</b>        |

## TEACHING TOOLS USED

- N1. Informative lecture  
 N2. Matlab and ATP-EMTP programs  
 N3. Project presentation

## EVALUATION OF SUBJECT LEARNING OUTCOMES ACHIEVEMENT

| Evaluation<br><i>F – forming (during semester)<br/>P – concluding (at semester end)</i> | Educational effect number                | Way of evaluating educational effect achievement |
|---|--|--|
| F1(w)   | PEU_W01<br>PEU_W02<br>PEU_W03            | Participation in the course                      |
| F2(w)   | PEU_W01<br>PEU_W02<br>PEU_W03            | Final examination                                |
| P(w)  | $P = 0,1F1 + 0,9F2$                      |  |
| F1(P)   | PEU_U01<br>PEU_U02<br>PEU_U03<br>PEU_K01 | Activity during the classes                      |
| F2(P)   | PEU_U01<br>PEU_U02<br>PEU_U03<br>PEU_K01 | Presentation of completion of the project        |
| P(P)  | $P = 0,2F1 + 0,8F2$                      |  |

|   |
|---|
| <b>PRIMARY AND SECONDARY LITERATURE</b> |
|---|

|                            |
|----------------------------|
| <b>PRIMARY LITERATURE:</b> |
|----------------------------|

- |   |
|---|
| <ul style="list-style-type: none"><li>[1] Flasiński M., Wstęp do sztucznej inteligencji, PWN, Warszawa 2011</li><li>[2] Rutkowski L., Metody i techniki sztucznej inteligencji, PWN, Warszawa 2009</li><li>[3] Rosołowski E.: Cyfrowe przetwarzanie sygnałów w automatyce elektroenergetycznej. Akademicka Oficyna Wydawnicza EXIT, Warszawa 2002</li><li>[4] Grzech A., Inżynieria wiedzy i systemy ekspertowe, Exit, Warszawa 2009</li><li>[5] Markowska-Kaczmar U., Kwaśnicka H., Sieci neuronowe w zastosowaniach, Oficyna Wyd. PWr, Wrocław 2005</li></ul> |
|---|

|                              |
|------------------------------|
| <b>SECONDARY LITERATURE:</b> |
|------------------------------|

- |   |
|---|
| <ul style="list-style-type: none"><li>[1] Rebizant W., Szafran J., Wiszniewski A., Digital signal processing in power system protection and control, Springer, London 2011</li><li>[2] Russel S.J., Norvig P., Artificial intelligence: a modern approach, Prentice Hall, Pearson, 2010</li><li>[3] James J. Buckley, Esfandiar Eslami, An introduction to fuzzy logic and fuzzy sets, Heidelberg Physica-Verlag, 2002</li><li>[4] Dillon T.S. and Niebur D. (edited by), Neural Network Applications in Power Systems, CRL Publishing Ltd., London, 1996</li><li>[5] Liebowitz J., The Handbook of applied expert systems, Boca Raton, CRC Press, 1998</li></ul> |
|---|

|                           |
|---------------------------|
| <b>SUBJECT SUPERVISOR</b> |
|---------------------------|

|   |
|---|
| Waldemar Rebizant, waldemar.rebizant@pwr.edu.pl |
|---|