



UNIVERSITI PUTRA MALAYSIA

***OPTIMAL OVERCURRENT RELAY COORDINATION IN WIND FARM
USING GENETIC ALGORITHM***

NIMA REZAEI

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**OPTIMAL OVERCURRENT RELAY COORDINATION IN WIND FARM
USING GENETIC ALGORITHM**

By

NIMA REZAEI

**Thesis Submitted to the School of Graduate Studies, Universiti Putra Malaysia, in
Fulfillment of the Requirements for the Degree of Master of Science**

December 2015

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DEDICATION

I would like to dedicate this project to my lovely wife, beloved parents, all my supervisors and lecturers in the Department of Electrical and Electronic Engineering and friends. Their guidance and relentless support have been a great inspiration to the realization of this project.

Abstract of thesis presented to the Senate of Universiti Putra Malaysia in fulfillment of the requirement for the Degree of Master of Science

**OPTIMAL OVERCURRENT RELAY COORDINATION IN WIND FARM
USING GENETIC ALGORITHM**

By

NIMA REZAEI

December 2015

Chair : Mohammad Lutfi Othman, PhD, PEng

Faculty : Engineering

Wind farms are ones of the most indispensable types of sustainable energies which are progressively engaged in smart grids with tenacity of electrical power generation predominantly as a distribution generation system. Thus, rigorous protection of wind power plants is an immensely momentous aspect in electrical power protection engineering which must be contemplated thoroughly during designing the wind plants to afford a proper protection for power components in case of fault occurrence. The most commodious protection apparatus are overcurrent relays (OCRs) which are responsible for protecting power systems from impending faults. In order to employ a prosperous and proper protection for wind farms, these relays must be set precisely and well-coordinated with each other to clear the faults at the system in the shortest possible time. These relays are set and coordinated with each other by applying IEEE or IEC standards methods, however, their operation times are relatively long and the coordination between these relays are not optimal. The other common problem in these power systems is when a fault occurs in a plant, several OCRs operate instead of a designated relay to that particular fault location. This, if undesirable can result in unnecessary power loss and disconnection of healthy feeders out of the plant which is extremely dire. It is necessary to address the problems related inefficient coordination of OCRs. Many suggestions have been made and approaches implemented, however one of the most prominent methods is the use of Genetic Algorithm (GA) to improve the function and coordination of OCRs. GA optimization technique was implemented in this project due to its ample advantages over other AI techniques including proving high accuracy, fast response and most importantly obtaining optimal solutions for nonlinear characteristics of OCRs. In addressing the mentioned problems, the main objective of this research is to improve the protection of wind farms by optimizing the relay settings, reducing their operation time, Time Setting Multiplier (TSM) of each relay, improving the coordination between relays after implementation of IEC 60255-151:2009 standard. The most recent and successful OF for GA technique has been used, unique parameters for GA was selected for this research to significantly improve the protection for wind farms that is highly better compared to any research accomplished before for the purpose of wind farm protection. GA was used to obtain improved values for each relay settings based on their coordination criteria. Each relay operation time and TSM are optimized which would contribute to provide a better protection for wind farm. Thus, the objective of this work which is improving the

protection of wind farms by optimizing the relay settings, reducing their operation time, Time Setting Multiplier (TSM) of each relay, improving the coordination between relays, have been successfully fulfilled and solved the problems associated with wind farm relay protection system settings. The new approach has shown significant improvement in operation of OCRs at the wind farm, have drastically reduced the accumulative operation time of the relays by 26.8735% (3.7623 seconds).

Abstrak tesis yang dikemukakan kepada Senat Universiti Putra Malaysia sebagai memenuhi keperluan untuk Ijazah Master Sains

OPTIMAL OVERCURRENT PENYELARASAN RELAY DALAM LADANG ANGIN MENGGUNAKAN GENETIK ALGORITMA

Oleh

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ladang angin adalah orang-orang satu jenis yang paling penting dalam tenaga mampan yang progresif terlibat dalam grid pintar dengan ketabahan penjanaan kuasa elektrik terutamanya sebagai sistem penjanaan pengedaran. Oleh itu, perlindungan yang ketat loji kuasa angin adalah satu aspek yang amat bersejarah dalam kejuruteraan perlindungan kuasa elektrik yang perlu dipertimbangkan dengan teliti semasa mereka bentuk tumbuh-tumbuhan angin untuk memberi perlindungan yang sesuai untuk komponen kuasa dalam kes kesalahan kejadian. Radas perlindungan paling lapang adalah geganti arus lebih (OCRs) yang bertanggungjawab untuk melindungi sistem kuasa dari kesalahan akan berlaku. Dalam usaha untuk mengambil perlindungan yang makmur dan wajar bagi ladang-ladang angin, relay ini mesti ditetapkan dengan tepat dan diselaraskan dengan baik antara satu sama lain untuk membersihkan kerosakan pada sistem ini dalam masa yang sesingkat mungkin. Ini geganti ditetapkan dan diselaraskan antara satu sama lain dengan menggunakan IEEE atau IEC standard kaedah, bagaimanapun, masa operasi mereka adalah agak panjang dan penyelarasan di antara geganti ini tidak optimum. Masalah biasa lain dalam sistem kuasa adalah apabila berlaku kesalahan dalam tumbuhan, beberapa OCRs beroperasi bukannya relay yang ditetapkan untuk bahawa lokasi kesalahan tertentu. Ini, jika tidak diingini boleh menyebabkan kehilangan kuasa yang tidak perlu dan pemotongan pemakan sihat daripada tumbuhan yang amat mengerikan. Ia adalah perlu untuk menangani masalah berkaitan penyelarasan yang tidak cekap OCRs. Banyak cadangan telah dibuat dan pendekatan yang dilaksanakan, namun salah satu kaedah yang paling menonjol ialah penggunaan algoritma genetik (GA) untuk meningkatkan fungsi dan penyelarasan OCRs. teknik pengoptimuman GA dilaksanakan dalam projek ini kerana kelebihan yang cukup ke atas teknik AI lain yang termasuk membuktikan ketepatan yang tinggi, tindak balas yang cepat dan yang paling penting mendapatkan penyelesaian optimum untuk ciri-ciri tak linear OCRs. Dalam menangani masalah yang dinyatakan, objektif utama kajian ini adalah untuk meningkatkan perlindungan ladang angin dengan mengoptimumkan tetapan geganti, mengurangkan masa operasi mereka, Masa Menetapkan Multiplier (TSM) setiap relay, meningkatkan penyelarasan di antara geganti selepas pelaksanaan IEC 60255-151: standard 2009. Yang baru-baru ini dan berjaya OF untuk teknik GA telah digunakan, parameter unik untuk GA telah dipilih untuk kajian ini dalam meningkatkan perlindungan untuk ladang angin yang sangat lebih baik berbanding dengan apa-apa penyelidikan dicapai sebelum ini untuk tujuan

perlindungan ladang angin. GA telah digunakan untuk mendapatkan nilai yang lebih baik untuk setiap tetapan geganti berdasarkan kriteria penyesuaian mereka. Setiap kali operasi relay dan TSM dioptimumkan yang akan menyumbang untuk memberi perlindungan yang lebih baik untuk ladang angin. Oleh itu, objektif kajian ini yang meningkatkan perlindungan ladang angin dengan mengoptimumkan tetapan geganti, mengurangkan masa operasi mereka, Masa Menetapkan Multiplier (TSM) setiap relay, meningkatkan penyesuaian di antara geganti, telah berjaya memenuhi dan menyelesaikan masalah berkaitan dengan tetapan sistem perlindungan relay ladang angin. Pendekatan baru telah menunjukkan peningkatan yang ketara dalam operasi OCRs di ladang angin, telah secara drastik mengurangkan masa operasi terkumpul geganti oleh 26,8735% (3,7623 saat).

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I certify that a Thesis Examination Committee has met on 22 December 2015 to conduct the final examination of Nima Rezaei on his thesis entitled "Optimal Overcurrent Relay Coordination in Wind Farm using Genetic Algorithm" in accordance with the Universities and University Colleges Act 1971 and the Constitution of the Universiti Putra Malaysia [P.U.(A) 106] 15 March 1998. The Committee recommends that the student be awarded the Master of Science.

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TABLE OF CONTENTS

	Page
ABSTRACT	i
ABSTRAK	iii
ACKNOWLEDGEMENT	v
APPROVAL	vi
DECLARATION	viii
LIST OF TABLES	xii
LIST OF FIGURES	xiii
LIST OF ABBREVIATIONS	xvi
CHAPTER	
1 INTRODUCTION	1
1.1 Background	1
1.1.1 Wind Power Plants	1
1.1.2 Why Wind Farms? (Wind Power Plants Advantages)	1
1.1.3 Wind Power Plants Protection Issues	2
1.2 Hypothesis of Research	2
1.3 Problems in Wind Farms Protection (The Problem Statements)	3
1.4 Objectives of Research	3
1.5 Scopes of Research	3
1.6 Thesis Layout	4
2 LITERATURE REVIEW	6
2.1 Introduction	6
2.2 Conventional approaches for Overcurrent Relays Coordination	6
2.3 Recent Approaches for Overcurrent Relays Coordination	7
2.3.1 Overcurrent Relays Coordination Using Fuzzy Logic and Rule Based Expert Systems	8
2.3.2 Overcurrent Relays Coordination Using Artificial Neural Network	9
2.3.3 Overcurrent Relays Coordination Using Evolutionary Computation Technique and Genetic Algorithm	10
2.3.4 Overcurrent Relays Coordination Using Physical Algorithms and Swarm Intelligence Techniques	18
2.4 Overcurrent Relay Coordination in Wind Farms	22
2.5 Summary	23
3 METHODOLOGY AND PROCEDURES	25
3.1 Introduction	25
3.2 Modeling and Simulation Contextual of Wind Farm	26
3.3 Modeling and Simulation Contextual of Overcurrent Relays	32
3.4 Coordination and Settings of Overcurrent Relays	33
3.4.1 Overcurrent Relay 12 Settings Calculation	35
3.4.2 Overcurrent Relay 11 Settings Calculation	37
3.4.3 Overcurrent Relay 10 Settings Calculation	38
3.4.4 Overcurrent Relay 9 Settings Calculation	39
3.5 Genetic Algorithm Optimization Method	41
3.6 GA Settings and Implementation for Optimal Coordination of	43

3.7	OCRs Summary	44
4	RESULTS AND DISCUSSIONS	46
4.1	Introduction	46
4.2	Simulation Results of Wind Farm Current Magnitude Flowing at each OCR during Normal Operation	46
4.3	Simulation Results of Wind Farm Current Magnitude Flowing at each OCR during Fault Incidence	48
4.4	OCRs Operation during Normal and Fault Incidence Condition	52
4.5	GA Optimization Results using Matlab Toolbox	56
4.6	Optimal OCRs Operation Time and TSM Values Obtained by GA Approach	59
4.7	GA Technique and Conventional Method Results Comparison	63
4.8	Summary	64
5	CONCLUSION	65
5.1	Conclusion	65
5.2	Contribution	65
5.3	Recommendation for Future Works	66
	REFERENCES	67
	APPENDICES	77
	BIODATA OF STUDENT	90
	LIST OF PUBLICATIONS	91

LIST OF TABLES

Table		Page
1	Recent Overcurrent Relays Coordination Using AI and NIA Techniques Review	19
2	Different characteristics of OCRs based on IEC 60255 standard	32
3	Current magnitude and short circuit current magnitude at each overcurrent relay	35
4	OCRs settings based on IEC 60255 standard	41
5	TSM values derived from GA optimization technique	57
6	OCRs settings based on GA technique	60
7	Main and backup relays function corresponding to the fault Locations	63
8	Results comparison between OCRs settings based on conventional method and GA optimization technique	63

LIST OF FIGURES

Figure		Page
1	Conventional approaches for overcurrent relays coordination	7
2	Recent approaches for overcurrent relays coordination	8
3	Research flow chart	26
4	Feeder-subfeeder wind farm topology based on SEL	28
5	Wind turbine power characteristic	28
6	Wind turbine doubly-fed induction generator characteristic	29
7	Wind turbine settings	29
8	Wind turbine converter settings	29
9	Wind turbine control settings	30
10	Three-phase Line parameters	30
11	Three-phase transformer low voltage side	31
12	Three-phase transformer high voltage side	31
13	Modelled overcurrent relay in Matlab	33
14	OCRs coordination in radial feeders	34
15	GA technique algorithm	43
16	Current flow through OCR12 during normal operation	47
17	Current flow through OCR11 during normal operation	47
18	Current flow through OCR2 during normal operation	47
19	Current flow through OCR1 during normal operation	48
20	Current flow through OCR12 during 1-phase to ground fault incidence	49
21	Current flow through OCR2 during 1-phase to ground fault incidence	49
22	Current flow through OCR1 during 1-phase to ground fault incidence	49
23	Current flow through OCR12 during 2-phase fault incidence	50
24	Current flow through OCR11 during 2-phase fault incidence	50
25	Current flow through OCR2 during 2-phase fault incidence	50
26	Current flow through OCR1 during 2-phase fault incidence	51
27	Current flow through OCR12 during 3-phase fault incidence	51
28	Current flow through OCR11 during 3-phase fault incidence	51
29	Current flow through OCR2 during 3-phase fault incidence	52
30	Current flow through OCR1 during 3-phase fault incidence	52

31	CB12 operation during fault incidence	53
32	CB11 operation during fault incidence	53
33	CB2 operation during fault incidence	54
34	CB2 operation during fault incidence	54
35	OCR12 trips during fault incidence	54
36	OCR11 trips during fault incidence	55
37	OCR2 trips during fault incidence	55
38	OCR1 trips during fault incidence	55
39	Coordination of OCRs for fault occurrence	56
40	Best individuals (TSM) obtained by GA	58
41	Average distance between individuals attained by GA	58
42	Best and mean fitness values obtained by GA	59
43	OCR12 tripping time after GA implementation	61
44	OCR11 tripping time after GA implementation	61
45	OCR2 tripping time after GA implementation	61
46	OCR1 tripping time after GA implementation	62
47	Coordination of OCRs after GA implementation	

LIST OF ABBREVIATIONS

ABC	Artificial Bees Colony
AI	Artificial Intelligence
ANFIS	Adaptive Network Fuzzy Inference System
ANN	Artificial Neural Network
BP	Breaking Point
CB	Circuit Breaker
CGA	Continuous Genetic Algorithm
CT	Current Transformer
CTI	Coordination Time Interval
DE	Differential Evolution
DFIG	Dual Fed Induction Generator
DG	Distribution Generation
DSP	Digital Signal Processing
EP	Evolutionary Programming
FBBC	Fuzzy Bang Bang Controller
FCL	Fault Current Limiter
FLC	Fuzzy Logic Controller
GA	Genetic Algorithm
GAMS	General Algebraic Modelling Software
HBA	Honey Bee Algorithm
HGAPSOA	Hybrid GA & PSO Algorithm
HSA	Harmony Search Algorithm
IHSA	Improvised Harmony Search Algorithm
LP	Linear Programming
LXPSO	Laplace Crossover Particle Swarm Optimization
NIA	Nature Inspired Algorithm
NLP	Nonlinear Programming
NM	Nelder Mead Simplex Search Method
OCDE	Opposition Based Chaotic Differential Evolution Algorithm
OCR	Overcurrent Relay
OF	Objective Function
PS	Plug Setting of the Relay
PSM	Plug Setting Multiplier
PSO	Particle Swarm Optimization
RBFNN	Radial Basis Function Neural Network
RSI	Relay Setting Current (Intensity)
ST	Slantlet Transform
TSM	Time Setting Multiplier
UFCL	Unidirectional Fault Current Limiter

CHAPTER 1

INTRODUCTION

1.1 Background

Human Activity and exhaustion of fossil fuels as the conventional method of power generation has overloaded our atmosphere with vast emission of carbon dioxide and consequently resulted in global warming, harmful impact on our environment and health. Thus a new supply for power generation that has no adverse effect on the atmosphere and our health must be employed. Renewable energies including wind power, solar energy, hydro power and geothermal energy have shown significant promise as a suitable replacement for fossil fuels. It is expected that in the upcoming future, a large share of power generation is directly derived from renewable energies (particularly wind, solar and hydro power) hence, reliance on fossil fuels will be drastically diminished.

1.1.1 Wind Power Plants

Due to the rapid growth in power demands, the ever increasing air pollution rate in addition to the decrease of unrenovable fossil fuels, there is an imminent necessity to transfer, at least partially, the dependence on fossil fuels to renewable energy resources. Among these resources, wind energy converted to electric energy has emerged as the leader at the present time (Dincer, 2000). Wind power plants have been vastly employed as the means of power generation in smart grids as a distribution generation (DG) systems (Mohd et al., 2008). Undoubtedly, wind power has come to be mainstay of the energy systems in several countries and is regarded as a reliable and financially reasonable source of electricity. The contribution of wind energy to power generation has reached a considerable share even on the worldwide level. Among many countries that are investing hugely on wind power generation, the top 10 leading nations in total power generation capacity are: China, USA, Germany, Spain, India, United Kingdom, Italy, France, Canada and Portugal (Heier, 2014).

The future of wind farms are very remarkable and astonishing since their costs are being dropped annually due to applauding advancement in wind turbine efficient power generation and using lighter and longer blades. Therefore they will attain a much higher share of power generation in many countries in the near future which would buoyantly result in gradual replacement for conventional air pollutant power plants based on fossil fuels including coal, gas and oil which are highly destructive and disparaging toward the environment (Chu et al., 2012).

1.1.2 Why Wind Farms? (Wind Power Plants Advantages)

Wind energy offers many advantages, which explains why it's the fastest-growing energy source in the world. Nowadays wind farms are being extensively implemented by many developing countries due to its ample advantages and financial aspects. Here

are the most significant advantages of wind farms stated as the following (Panwar et al., 2011):

- i. Wind Energy is an inexhaustible source of energy and is virtually a limitless resource
- ii. Electricity created using wind energy do not produce any greenhouse gases and therefore do not pollute the environment
- iii. Wind turbines take up less space than the average power station. Wind turbines only have to occupy a few square meters for the base, this allows the land around the turbine to be used for many purposes, for example agriculture
- iv. This source of energy has tremendous potential to generate energy on large scale
- v. Wind energy can be used directly as mechanical energy
- vi. Marginal maintenance and less construction cost required
- vii. The cost of wind farms are getting diminished gradually as a result of new technologies and advancement emerged
- viii. Capable of getting connected to smart grids as a DG system
- ix. Able to produce abundant power energy in GW capacity
- x. In remote areas, wind turbines can be used as great resource to generate energy and also reduce costs due to elimination of transmission lines and power energy loss reduction
- xi. In combination with solar energy they can be used to provide reliable as well as steady supply of electricity
- xii. Land around wind turbines can be used for other uses, e.g. farming

1.1.3 Wind Power Plants Protection Issues

The impressive growth in the utilization of wind energy has consequently spawned active research activities in a wide variety of technical fields. Progressively amplification of grids by wind farms have led to emergence of some significant electrical issues including security, protection, stability, reliability and power quality. Among these issues, protection aspect plays an enormous role which needs a serious attention by researchers. Although protection of wind farms is a crucial issue that needs a huge attention, wind power plants still implement simple protection schemes which lead to different levels of damages to power components in the plant. Moreover, most of the researches conducted regarding wind farm protection have been abundantly restricted to literatures and methodologies (Kawady et al., 2008). As reported by (Bauscke et al., 2006), different levels of damage were recorded resulting occasionally from the drawbacks of the associated protection systems. However an overall protection scheme has yet to come to solve the protection crisis in wind plants (Qureshi et al., 2014).

1.2 Hypothesis of Research

Employing Overcurrent Relays (OCRs) as the proper protection system to provide a suitable protection for wind farms. Adapting the correct settings for OCRs based on IEC 60255-151:2009 standard, provide a proper coordination between the relays in the wind farms to protect apparatus in the presence of fault (Bajánek et al., 2015), (Almas et al., 2012). Implementing Genetic Algorithm (GA) approach as a vigorous and

successful method of optimization in order to decrease TSM, operation time of OCRs, consequently optimizing OCRs settings and reaching optimal setting values for OCRs in the wind farm.

1.3 Problems in Wind Farms Protection (The Problem Statements)

As aforementioned, the increasing integration of wind power plants to power grids and their vast utilization have led to emergence of some electrical issues related to security, protection, stability, reliability and power quality. Increase in number of faults in power systems and consequently wind plant protection failures have caused further damages to power systems and accordingly hiked the costs (Kawady et al., 2009), (Yang et al., 2010). The main wind farm protection problems are:

- Improper and non-optimal conventional settings for overcurrent relays in wind farms. The coordination settings between these relays are not optimal (Kawady et al., 2010) which consequently would result in:
 1. Miscoordination in high current faults, cause crucial damages to power apparatus
 2. Operation of Several relays, causing extended power loss, compromised power quality and stability
- OCR operation times are quite long that damage power apparatus, installation and endanger personnel safety.

These problems are resulted from lack of optimization such as failing to implement optimization techniques including GA technique in order to improve and optimize OCR settings. There are much rooms for improvement of wind plants by using optimization techniques in order to reduce the operation time of relays and enhance the relay coordination.

1.4 Objectives of Research

In addressing the above mentioned problems, the main objectives of this research is:

- Improving the protection of wind farms by enhancing the coordination between relays, by way of optimizing the relay settings according to IEC 60255-151:2009 standard through the optimization of TSM and subsequently the operation time of each relay.
- Implementing GA, as a powerful optimization branch of artificial intelligence approach, to obtain improved values for each relay settings based on their coordination criteria. Each relay operation time and TSM are optimized by using GA method which would consequently contribute to provide a better protection for wind farms.

1.5 Scopes of Research

In this study, only protection of power apparatus within the wind farm has been studied and has not discussed the protection outside the wind farm, including power grids. This study has discussed modelling and simulation of wind farm based on SEL, modelling

and simulation of overcurrent relays based on IEC 60255-151:2009 standard in Matlab/Simulink software. Moreover, Genetic Algorithm simulation and coding with the purpose of overcurrent relay coordination was carried out in Matlab/Toolbox.

1.6 Thesis Layout

Chapter 1, the current (Introduction), provides an insight on the necessity and importance of providing a proper protection for wind farms by using OCRs and improving their settings, coordination between relays in a feeder from grid to the wind turbines, decreasing T and TSM for each relay by applying GA technique in order to optimize the relays settings.

Chapter 2 (Literature Review) discusses reviews on different artificial intelligence techniques which have been successfully implemented for OCRs in different schemes including in distribution systems, power plants, transmission lines and etc. This chapter also provides a review on GA technique applied by researchers in order to optimize OCRs settings and coordination between them which is so crucial in protection of power components.

Chapter 3 (Methodology and Procedures) discusses the elaborate steps in achieving the research objectives that is to optimize the OCRs settings T and TSM of each relay, improving their coordination by using GA approach. In this chapter, various steps are demonstrated including modelling and simulation of wind farms, modelling and simulation of OCRs, selecting the proper settings for each relay based on the data calculated by wind farms simulation and IEC 60255-151:2009 standard, Selecting the proper objective function for GA technique, using GA Toolbox from Matlab/Simulink software in order to define, program and set the characteristic of the algorithm for the relays in a feeder and finally use these GA settings in order to optimize the relays settings.

Chapter 4 (Results and Discussions) presents the results and explanations on subjects discussed in chapter 3: Modelling and simulation of a typical wind power plant using Matlab/Simulink software, designating the proper location of OCRs protection systems in order to protect the power components from faults, modelling and simulation of OCRs based on IEC 60255-151:2009 standard with Matlab/Simulink software, extracting the data from current magnitudes flowing to each OCR before, during and after fault occurrence, selecting the suitable OCRs settings based on IEC 60255 standard for each relay and considering the coordination of the relays with each other, testing and validating the designed OCRs protection system in order to ensure its reliability to provide the wind farms with proper protection, selecting the appropriate objective function for Genetic Algorithm technique, using Genetic Algorithm Toolbox from Matlab/Simulink software in order to define, program and set the characteristic of the algorithm for the relays in a feeder, optimizing the OCRs settings including T and TSM of each relay by the programmed Genetic Algorithm and improve the protection for the wind farm, testing the new approach and validating the OCRs settings and their coordination from the grid to the wind source in each feeder for variant positions of faults, compare the results of the conventional approach for OCRs coordination with

results obtained by applying Genetic Algorithm technique used for optimizing the OCRs settings.

Chapter 5 (Conclusion) shall derive the conclusion on the research work, discuss the research contributions and recommend some potential future researches.

REFERENCES

- Abyaneh, H. A., Faez, K., & Karegar, H. K. (1997, December). A new method for overcurrent relay (O/C) using neural network and fuzzy logic. In *TENCON'97. IEEE Region 10 Annual Conference. Speech and Image Technologies for Computing and Telecommunications., Proceedings of IEEE (Vol. 1, pp. 407-410)*. IEEE.
- Abyaneh, H. A., Al-Dabbagh, M., Karegar, H. K., Sadeghi, S. H. H., & Khan, R. J. (2003). A new optimal approach for coordination of overcurrent relays in interconnected power systems. *Power Delivery, IEEE Transactions on*, 18(2), 430-435.
- Abyaneh, H. A., Kamangar, S. S. H., Razavi, F., & Chabanloo, R. M. (2008, September). A new genetic algorithm method for optimal coordination of overcurrent relays in a mixed protection scheme with distance relays. In *Universities Power Engineering Conference, 2008. UPEC 2008. 43rd International (pp. 1-5)*. IEEE.
- Abyaneh, H. A., Razavi, F., Al-Dabbagh, M., Sedeghi, H., & Kazemkargar, H. (2007). A comprehensive method for break points finding based on expert system for protection coordination in power systems. *Electric power systems research*, 77(5), 660-672.
- Alander, J. T., Mantere, T., Moghadampour, G., & Matila, J. (1998). Searching protection relay response time extremes using genetic algorithm—software quality by optimization. *Electric Power Systems Research*, 46(3), 229-233.
- Almas, M. S., Leelaruji, R., & Vanfretti, L. (2012, October). Over-current relay model implementation for real time simulation & Hardware-in-the-Loop (HIL) validation. In *IECON 2012-38th Annual Conference on IEEE Industrial Electronics Society (pp. 4789-4796)*. IEEE.
- Amraee, T. (2012). Coordination of Directional Overcurrent Relays Using Seeker Algorithm. *Power Delivery, IEEE Transactions on*, 27(3), 1415-1422.
- Asadi, M. R., Askarian Abyaneh, H., Mahmoodan, M., Naghizadeh, R. A., & Koochaki, A. (2008, May). Optimal Overcurrent relays coordination using genetic algorithm. In *Optimization of Electrical and Electronic Equipment, 2008. OPTIM 2008. 11th International Conference on (pp. 197-202)*. IEEE.
- Asadi, M. R., Askarian Abyaneh, H., Mahmoodan, M., Naghizadeh, R. A., & Koochaki, A. (2008, May). Optimal Overcurrent relays coordination using genetic algorithm. In *Optimization of Electrical and Electronic Equipment, 2008. OPTIM 2008. 11th International Conference on (pp. 197-202)*. IEEE.
- Askarian, H., Mohammadi, R., Razavi, F., Khoddami, M., & Torkaman, H. (2007). A New Genetic Algorithm Method for Overcurrent Relays and Fuses Coordination. *Evaluation*, 2(2), 2.

- Bajānek, T. (2015). Instantaneous and Definite Time Overcurrent Protection Algorithms. *In Proceedings of the 21st Conference STUDENT EEICT 2015. Vysoké učení technické v Brně, Fakulta elektrotechniky a komunikačních technologií.*
- Bansal, J. C., & Deep, K. (2008, September). Optimization of directional overcurrent relay times by particle swarm optimization. *In Swarm Intelligence Symposium, 2008. SIS 2008. IEEE (pp. 1-7). IEEE.*
- Barzegari, M., Bathaee, S. M. T., & Alizadeh, M. (2010, May). Optimal coordination of directional overcurrent relays using harmony search algorithm. *In Environment and Electrical Engineering (EEEIC), 2010 9th International Conference on (pp. 321-324). IEEE.*
- Bashir, M., Taghizadeh, M., Sadeh, J., & Mashhadi, H. R. (2010, October). A new hybrid particle swarm optimization for optimal coordination of over current relay. *In Power System Technology (POWERCON), 2010 International Conference on (pp. 1-6). IEEE.*
- Bauschke, S., Obkircher, C., Achleitner, G., Fickert, L., & Sakulin, M. (2006, September). Improved protection system for electrical components in wind energy plants. *In 15th International Conference on Power System Protection, PSP.*
- Bedekar, P. P., & Bhide, S. R. (2011). Optimum coordination of directional overcurrent relays using the hybrid GA-NLP approach. *Power Delivery, IEEE Transactions on, 26(1), 109-119.*
- Bedekar, P. P., & Bhide, S. R. (2011). Optimum coordination of overcurrent relay timing using continuous genetic algorithm. *Expert Systems with Applications, 38(9), 11286-11292.*
- Bedekar, P. P., Bhide, S. R., & Kale, V. S. (2009). Optimum time coordination of overcurrent relays in distribution system using Big-M (Penalty) method. *WSEAS Trans. on Power Systems, 4(11), 341-350.*
- Bedekar, P. P., Bhide, S. R., & Kale, V. S. (2009). Optimum time coordination of overcurrent relays using two phase simplex method. *World Academy of Science, Engineering and Technology, 52, 1110-1114.*
- Bedekar, P. P., Bhide, S. R., & Kale, V. S. (2009, December). Optimum coordination of overcurrent relays in distribution system using genetic algorithm. *In Power Systems, 2009. ICPS'09. International Conference on (pp. 1-6). IEEE.*
- Bedekar, P. P., Bhide, S. R., & Kale, V. S. (2009, December). Optimum coordination of overcurrent relays in distribution system using dual simplex method. *In Emerging Trends in Engineering and Technology (ICETET), 2009 2nd International Conference on (pp. 555-559). IEEE.*
- Bedekar, P. P., Bhide, S. R., & Kale, V. S. (2009, June). Coordination of overcurrent relays in distribution system using linear programming technique. *In Control, Automation,*

- Communication and Energy Conservation, 2009. *INCACEC 2009. 2009 International Conference on* (pp. 1-4). *IEEE*.
- Bedekar, P. P., Bhide, S. R., & Kale, V. S. (2011, May). Determining optimum TMS and PS of overcurrent relays using linear programming technique. *In Electrical Engineering/Electronics, Computer, Telecommunications and Information Technology (ECTI-CON), 2011 8th International Conference on* (pp. 700-703). *IEEE*.
- Bingul, Z. (2007). Adaptive genetic algorithms applied to dynamic multiobjective problems. *Applied Soft Computing*, 7(3), 791-799.
- Birla, D., Maheshwari, R. P., & Gupta, H. O. (2005). Time-overcurrent relay coordination: A review. *International Journal of Emerging Electric Power Systems*, 2(2).
- Blackburn, J. L., & Domin, T. J. (2006). Protective relaying: principles and applications. *CRC press*.
- Chabanloo, R. M., Abyaneh, H. A., Kamangar, S. S. H., & Razavi, F. (2008, December). A new genetic algorithm method for optimal coordination of overcurrent and distance relays considering various characteristics for overcurrent relays. *In Power and Energy Conference, 2008. PECon 2008. IEEE 2nd International* (pp. 569-573). *IEEE*.
- Chabanloo, R. M., Abyaneh, H. A., Kamangar, S. S. H., & Razavi, F. (2011). Optimal Combined Overcurrent and Distance Relays Coordination Incorporating Intelligent Overcurrent Relays Characteristic Selection. *Power Delivery, IEEE Transactions on*, 26(3), 1381-1391.
- Chatterjee, A., Maitra, M., & Goswami, S. K. (2009). Classification of overcurrent and inrush current for power system reliability using Slantlet transform and artificial neural network. *Expert Systems with Applications*, 36(2), 2391-2399.
- Chaudhari, V. S., Upadhyay, V. J., & Ahemedabad, G. (2011). Coordination of overcurrent relay in interconnected power system protection. *In National Conference on Recent Trends in Engineering & Technology*.
- Chaudhary, S. K., Teodorescu, R., Rodriguez, P., & Kjær, P. C. Over-current Relay Coordination for the Protection of Offshore Wind Power Grid with HVDC Connection. Available at proceedings.ewea.org/annual2012/.../1136_EWEA_2012_presentation.
- Chelliah, T. R., Thangaraj, R., Allamsetty, S., & Pant, M. (2014). Coordination of directional overcurrent relays using opposition based chaotic differential evolution algorithm. *International Journal of Electrical Power & Energy Systems*, 55, 341-350.
- Chen, B., Shrestha, A., Ituzaro, F. A., & Fischer, N. (2015, March). Addressing protection challenges associated with Type 3 and Type 4 wind turbine generators. *In*

Protective Relay Engineers, 2015 68th Annual Conference for (pp. 335-344).
IEEE.

- Chen, C. R., Lee, C. H., & Chang, C. J. (2013). Optimal overcurrent relay coordination in power distribution system using a new approach. *International Journal of Electrical Power & Energy Systems*, 45(1), 217-222.
- Chu, S., & Majumdar, A. (2012). Opportunities and challenges for a sustainable energy future. *nature*, 488(7411), 294-303.
- Coello, C. A. C., Van Veldhuizen, D. A., & Lamont, G. B. (2002). Evolutionary algorithms for solving multi-objective problems (Vol. 242). *New York: Kluwer Academic.*
- Deep, K., & Bansal, J. C. (2009, December). Optimization of directional overcurrent relay times using Laplace Crossover Particle Swarm Optimization (LXPSO). In *Nature & Biologically Inspired Computing, 2009. NaBIC 2009. World Congress on* (pp. 288-293). *IEEE.*
- Dincer, I. (2000). Renewable energy and sustainable development: a crucial review. *Renewable and Sustainable Energy Reviews*, 4(2), 157-175.
- Eiben, A. E., & Smith, J. E. (2003). Introduction to evolutionary computing. *Springer.*
- El Itani, S., & Joós, G. (2012). Advanced wind generator controls: meeting the evolving grid interconnection requirements. *INTECH Open Access Publisher.*
- Ezzeddine, M., & Kaczmarek, R. (2011). A novel method for optimal coordination of directional overcurrent relays considering their available discrete settings and several operation characteristics. *Electric Power Systems Research*, 81(7), 1475-1481.
- Geethanjali, M., & Raja Slochanal, S. M. (2008). A combined adaptive network and fuzzy inference system (ANFIS) approach for overcurrent relay system. *Neurocomputing*, 71(4), 895-903.
- Gen, M., & Cheng, R. (2000). Genetic algorithms and engineering optimization (Vol. 7). *John Wiley & Sons.*
- Gers, J. M., Holmes, E. J., & Holmes, E. J. (2005, July). Protection of electricity distribution networks. *Institution of Electrical Engineers.*
- Gholinezhad, J., Mazlumi, K., & Farhang, P. (2011, May). Overcurrent relay coordination using MINLP technique. In *Electrical Engineering (ICEE), 2011 19th Iranian Conference on* (pp. 1-6). *IEEE.*
- Goh, Y. L., Ramasamy, A. K., Nagi, F. H., & Abidin, A. A. Z. (2011). DSP based overcurrent relay using fuzzy bang-bang controller. *Microelectronics Reliability*, 51(12), 2366-2373.

- Goh, Y. L., Ramasamy, A. K., Nagi, F. H., & Zainul Abidin, A. A. (2013). DSP based fuzzy and conventional overcurrent relay controller comparisons. *Microelectronics Reliability*.
- Hakimi-Asiabar, M., Ghodsypour, S. H., & Kerachian, R. (2010). Deriving operating policies for multi-objective reservoir systems: application of self-learning genetic algorithm. *Applied Soft Computing*, 10(4), 1151-1163.
- Haslam, S. J., Crossley, P. A., & Jenkins, N. (1999, January). Design and evaluation of a wind farm protection relay. In *Generation, Transmission and Distribution, IEE Proceedings- (Vol. 146, No. 1, pp. 37-44). IET*.
- Heier, S. (2014). Grid integration of wind energy. *John Wiley & Sons*.
- Hewitson, L., Brown, M., & Balakrishnan, R. (2004). Practical power system protection. *Access Online via Elsevier*.
- Hornak, D., & Chau, N. H. J. (2004). Green power-wind generated protection and control considerations. In *Protective Relay Engineers, 2004 57th Annual Conference for (pp. 110-131). IEEE*.
- Horowitz, S. H., & Phadke, A. G. (2008). Power system relaying (Vol. 22). *Wiley. com*.
- Houck, C. R., Joines, J., & Kay, M. G. (1995). A genetic algorithm for function optimization: a Matlab implementation. *NCSU-IE TR, 95(09)*.
- Hussain, M. H., Musirin, I., Rahim, S. R. A., & Abidin, A. F. Computational Intelligence Based Technique in Optimal Overcurrent Relay Coordination: A Review.
- Hussain, M. H., Rahim, S. R. A., & Musirin, I. (2013). Optimal Overcurrent Relay Coordination: A Review. *Procedia Engineering*, 53, 332-336.
- Jenkins, L., Khincha, H. P., Shivakumar, S., & Dash, P. K. (1992). An application of functional dependencies to the topological analysis of protection schemes. *Power Delivery, IEEE Transactions on*, 7(1), 77-83.
- Johnson, J. M., & Rahmat-Samii, V. (1997). Genetic algorithms in engineering electromagnetics. *Antennas and Propagation Magazine, IEEE*, 39(4), 7-21.
- Kamangar, S., Abyaneh, H. A., Chabanloo, R. M., & Razavi, F. (2009, June). A new genetic algorithm method for optimal coordination of overcurrent and earth fault relays in networks with different levels of voltages. In *PowerTech, 2009 IEEE Bucharest (pp. 1-5). IEEE*.
- Karegar, H. K., Abyaneh, H. A., & Al-Dabbagh, M. (2003). A flexible approach for overcurrent relay characteristics simulation. *Electric Power Systems Research*, 66(3), 233-239.
- Kavehnia, F., Seifi, H., Keivani, H., & Askari, M. R. (2006, September). Optimal coordination of directional over current relays in power system using genetic

- algorithm. In *Universities Power Engineering Conference, 2006. UPEC'06. Proceedings of the 41st International (Vol. 3, pp. 824-827). IEEE.*
- Kawady, T. A., Mansour, N., & Taalab, A. (2008, July). Performance evaluation of conventional protection systems for wind farms. In *Power and Energy Society General Meeting-Conversion and Delivery of Electrical Energy in the 21st Century, 2008 IEEE (pp. 1-7). IEEE.*
- Kawady, T. A., Mansour, N., & Taalab, A. (2009, July). Evaluating the role of current limiting fuses for wind farm protection applications. In *Power & Energy Society General Meeting, 2009. PES'09. IEEE (pp. 1-7). IEEE.*
- Kawady, T., Feltes, C., Erlich, I., & Taalab, A. I. (2010, July). Protection system behavior of DFIG based wind farms for grid-faults with practical considerations. In *Power and Energy Society General Meeting, 2010 IEEE (pp. 1-6). IEEE.*
- Kawady, T., Mansour, N., Osheiba, A., & Taalab, A. M. (2008, March). Dynamic modeling of Al-Zaafarana wind farm for protection applications. In *Power System Conference, 2008. MEPCON 2008. 12th International Middle-East (pp. 277-281). IEEE.*
- Kawahara, K., Sasaki, H., Kubokawa, J., Kitagawa, M., & Sugihara, H. (1995). Expert system for designing transmission line protection system. *International Journal of Electrical Power & Energy Systems, 17(1), 69-78.*
- Koochaki, A., Asadi, M. R., Mahmoodan, M., & Naghizadeh, R. A. (2008). Optimal overcurrent relays coordination using genetic algorithm. *Optim. Of Electrical and Eletronic Equip, 197-202.*
- Levitin, G., Mazal-Tov, S., & Elmakis, D. (1994). Optimal sectionalizer allocation in electric distribution systems by genetic algorithm. *Electric Power Systems Research, 31(2), 97-102.*
- Liu, A., & Yang, M. T. (2012, June). Optimal Coordination of Directional Overcurrent Relays Using NM-PSO Technique. In *Computer, Consumer and Control (IS3C), 2012 International Symposium on (pp. 678-681). IEEE.*
- Mansour, M. M., Mekhamer, S. F., & El-Kharbawe, N. S. (2007). A modified particle swarm optimizer for the coordination of directional overcurrent relays. *Power Delivery, IEEE Transactions on, 22(3), 1400-1410.*
- Mason, C. R. (1956). *The art and science of protective relaying.* Wiley.
- Mohammadi, R., Abyaneh, H. A., Rudsari, H. M., Fathi, S. H., & Rastegar, H. (2011). Overcurrent relays coordination considering the priority of constraints. *Power Delivery, IEEE Transactions on, 26(3), 1927-1938.*
- Mohd, A., Ortjohann, E., Schmelter, A., Hamsic, N., & Morton, D. (2008, June). Challenges in integrating distributed energy storage systems into future smart grid.

- In *Industrial Electronics, 2008. ISIE 2008. IEEE International Symposium on* (pp. 1627-1632). IEEE.
- Moirangthem, J., Krishnanand, K. R., & Saranjit, N. (2011, December). Optimal coordination of overcurrent relay using an enhanced discrete differential evolution algorithm in a distribution system with DG. In *Energy, Automation, and Signal (ICEAS), 2011 International Conference on* (pp. 1-6). IEEE.
- Moravej, Z., Jazaeri, M., & Gholamzadeh, M. (2012). Optimal coordination of distance and over-current relays in series compensated systems based on MAPSO. *Energy Conversion and Management, 56*, 140-151.
- Mousavi Motlagh, S. H., & Mazlumi, K. (2014). Optimal Overcurrent Relay Coordination Using Optimized Objective Function. *ISRN Power Engineering, 2014*.
- Nair, D. S., & Reshma, S. (2013, February). Optimal coordination of protective relays. In *Power, Energy and Control (ICPEC), 2013 International Conference on*(pp. 239-244). IEEE.
- Negnevitsky, M. (2011). *Artificial Intelligence: A Guide to Intelligent Systems Third Edition*.
- Noghabi, A. S., Sadeh, J., & Mashhadi, H. R. (2009). Considering different network topologies in optimal overcurrent relay coordination using a hybrid GA. *Power Delivery, IEEE Transactions on, 24*(4), 1857-1863.
- Oduguwa, V., Tiwari, A., & Roy, R. (2005). Evolutionary computing in manufacturing industry: an overview of recent applications. *Applied Soft Computing, 5*(3), 281-299.
- Panwar, N. L., Kaushik, S. C., & Kothari, S. (2011). Role of renewable energy sources in environmental protection: a review. *Renewable and Sustainable Energy Reviews, 15*(3), 1513-1524.
- Pilo, F., Soma, G. G., Ruggeri, S., & Celli, G. (2012, April). Optimal protection devices allocation and coordination in MV distribution networks. In *Developments in Power Systems Protection, 2012. DPSP 2012. 11th International Conference on* (pp. 1-6). IET.
- Qureshi, W. A., & Nair, N. K. C. (2014). Wind Farm Protection. In *Large Scale Renewable Power Generation* (pp. 311-329). Springer Singapore.
- Rao, S. S., & Rao, S. S. (2009). *Engineering optimization: theory and practice*. John Wiley & Sons.
- Raphael, B., & Smith, I. F. C. (2003). A direct stochastic algorithm for global search. *Applied Mathematics and computation, 146*(2), 729-758.

- Razavi, F., Abyaneh, H. A., Al-Dabbagh, M., Mohammadi, R., & Torkaman, H. (2008). A new comprehensive genetic algorithm method for optimal overcurrent relays coordination. *Electric Power Systems Research*, 78(4), 713-720.
- Reichard, M. L., Finney, D., & Garrity, J. T. (2007, March). Windfarm System Protection Using Peer-to-Peer Communications. In *Protective Relay Engineers, 2007. 60th Annual Conference for* (pp. 511-521). IEEE.
- Rodporn, S., Uthitsunthorn, D., Kulworawanichpong, T., Oonsivilai, R., & Oonsivilai, A. (2012, May). Optimal coordination of over-current relays using differential evolution. In *Electrical Engineering/Electronics, Computer, Telecommunications and Information Technology (ECTI-CON), 2012 9th International Conference on*(pp. 1-4). IEEE.
- Sadeh, J., Aminotojari, V., & Bashir, M. (2011, May). Optimal coordination of overcurrent and distance relays with hybrid genetic algorithm. In *Environment and Electrical Engineering (EEEIC), 2011 10th International Conference on* (pp. 1-5). IEEE.
- Shen, C., Wang, L., & Li, Q. (2007). Optimization of injection molding process parameters using combination of artificial neural network and genetic algorithm method. *Journal of Materials Processing Technology*, 183(2), 412-418.
- Shi, X. H., Wan, L. M., Lee, H. P., Yang, X. W., Wang, L. M., & Liang, Y. C. (2003, November). An improved genetic algorithm with variable population-size and a PSO-GA based hybrid evolutionary algorithm. In *Machine Learning and Cybernetics, 2003 International Conference on* (Vol. 3, pp. 1735-1740). IEEE.
- Singh, D. K., & Gupta, S. (2012, March). Optimal coordination of directional overcurrent relays: A genetic algorithm approach. In *Electrical, Electronics and Computer Science (SCEECS), 2012 IEEE Students' Conference on* (pp. 1-4). IEEE.
- Singh, D. K., & Gupta, S. (2012, March). Use of genetic algorithms (GA) for optimal coordination of directional over current relays. In *Engineering and Systems (SCES), 2012 Students Conference on* (pp. 1-5). IEEE.
- Singh, M., Panigrahi, B. K., & Abhyankar, A. R. (2011). Optimal overcurrent relay coordination in distribution system. In *Proceedings-2011 International Conference on Energy, Automation and Signal, ICEAS-2011* (pp. 822-827).
- Singh, M., Panigrahi, B. K., & Abhyankar, A. R. (2011, December). Optimal overcurrent relay coordination in distribution system. In *Energy, Automation, and Signal (ICEAS), 2011 International Conference on* (pp. 1-6). IEEE.
- Singh, M., Panigrahi, B. K., Abhyankar, A. R., & Das, S. (2013). Optimal Coordination of Directional over-current Relays using Informative Differential Evolution Algorithm. *Journal of Computational Science*.
- Sivanandam, S. N., & Deepa, S. N. (2008). Genetic Algorithm Optimization Problems (pp. 165-209). Springer Berlin Heidelberg.

- Smolleck, H. A. (1979). A simple method for obtaining feasible computational models for the time-current characteristics of industrial power-system protective devices. *Electric Power Systems Research*, 2(1), 65-69.
- So, C. W., & Li, K. K. (2000). Overcurrent relay coordination by evolutionary programming. *Electric Power Systems Research*, 53(2), 83-90.
- So, C. W., & Li, K. K. (2002, October). Protection relay coordination on ring-fed distribution network with distributed generations. In *TENCON'02. Proceedings. 2002 IEEE Region 10 Conference on Computers, Communications, Control and Power Engineering (Vol. 3, pp. 1885-1888)*. IEEE.
- So, C. W., Li, K. K., Lai, K. T., & Fung, K. Y. (1997). Application of genetic algorithm for overcurrent relay coordination.
- Souza Jr, F. C., & de Souza, B. A. Optimal coordination of mixed scheme protection using Genetic Algorithm.
- Sueiro, J. A., Diaz-Dorado, E., Míguez, E., & Cidrás, J. (2012). Coordination of directional overcurrent relay using evolutionary algorithm and linear programming. *International Journal of Electrical Power & Energy Systems*, 42(1), 299-305.
- Trecat, J., & Jianping, W. (1991). An expert system for distribution substation fault diagnosis and backup protection. *International Journal of Electrical Power & Energy Systems*, 13(6), 303-307.
- Urdaneta, A. J., Nadira, R., & Perez Jimenez, L. G. (1988). Optimal coordination of directional overcurrent relays in interconnected power systems. *Power Delivery, IEEE Transactions on*, 3(3), 903-911.
- Uthitsunthorn, D., & Kulworawanichpong, T. (2010, June). Optimal overcurrent relay coordination using genetic algorithms. In *Advances in Energy Engineering (ICAEE), 2010 International Conference on (pp. 162-165)*. IEEE.
- Uthitsunthorn, D., Pao-La-Or, P., & Kulworawanichpong, T. (2011, May). Optimal overcurrent relay coordination using artificial bees colony algorithm. In *Electrical Engineering/Electronics, Computer, Telecommunications and Information Technology (ECTI-CON), 2011 8th International Conference on (pp. 901-904)*. IEEE.
- WANG, Y., YIN, X., ZHAO, Y., & ZHANG, Z. (2008). Regional Power Network Intelligent Protection Based on Genetic Algorithm [J]. *Automation of Electric Power Systems*, 17, 012.
- Wen, F., & Chang, C. S. (1998). A new approach to fault diagnosis in electrical distribution networks using a genetic algorithm. *Artificial Intelligence in Engineering*, 12(1), 69-80.

- Yang, H., Wen, F., & Ledwich, G. (2011). Optimal coordination of overcurrent relays in distribution systems with distributed generators based on differential evolution algorithm. *European Transactions on Electrical Power*.
- Yang, J., Fletcher, J. E., & O'Reilly, J. (2010). Multiterminal DC wind farm collection grid internal fault analysis and protection design. *Power Delivery, IEEE Transactions on*, 25(4), 2308-2318.
- Zayandehroodi, H., Mohamed, A., Shareef, H., & Farhoodnea, M. (2012). A novel neural network and backtracking based protection coordination scheme for distribution system with distributed generation. *International Journal of Electrical Power & Energy Systems*, 43(1), 868-879.
- Zeineldin, H. H., El-Saadany, E. F., & Salama, M. M. A. (2006). Optimal coordination of overcurrent relays using a modified particle swarm optimization. *Electric Power Systems Research*, 76(11), 988-995.

BIODATA OF STUDENT

Nima Rezaei was born in Shiraz, Iran, on July 26, 1990. He received the B.S degree from Science and Research of Fars University in 2012 and he is currently pursuing M.S. Degree in Electrical Power Engineering at Universiti Putra Malaysia (UPM), in Malaysia. His field of interest includes Electrical Power Protection Systems, Wind Power Plants Protection System Design and Calculation, Optimization Tools using Artificial Intelligence, Renewable Energies and Electrical Power Engineering.

He has published several papers in international journals and conferences with the research emphasis on wind power plants protection using overcurrent relay, Coordination of overcurrent relays, Optimizing overcurrent relay coordination using Genetic Algorithm Artificial Intelligence approach, power quality and electrical power protection system improvement. In the course of his master, one of his papers won “the best student paper award” during “PEcon IEEE conference”. Moreover during international conference in South Korea, one of his papers was selected as “one of the most outstanding papers”.

LIST OF PUBLICATIONS

- Rezaei, N.; Othman, M. L.; Wahab, N. I. A.; Hizam, H.; Maghami, M. R.; Hajighorbani, S.; & Olufemi, O. E. (2014). Optimal Coordination of Overcurrent Relays in Power Systems Protection: A Review. *Jökull Journal*, 64(4).
- Rezaei, N.; Othman, M. L.; Wahab, N. I. A.; Hizam, H.; & Olufemi, O. E. (2014). Wind Power Plants Protection Using Overcurrent Relays. *Universal Journal of Electrical and Electronic Engineering* Vol. 2(8), pp. 311 – 319.
- Rezaei, N.; Othman, M. L.; Wahab, N. I. A. & Hizam, H. (2014). Coordination of Overcurrent Relays Protection Systems for Wind Power Plants. *In Power and Energy (PECon), 2014 IEEE International Conference on* (pp. 394-399).
- Rezaei, N.; Othman, M. L.; Wahab, N. I. A. & Hizam, H & Moazami, A. (2015). Optimal Coordination of Overcurrent Relays in Power Systems Protection using Genetic Algorithm Approach. *Asian Academic Research Associates (AARA)*. Vol.2(2),pp. 404 – 431.



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