# 

## بسم الله الرحمن الرحيم

قال تعالى:

{وَلَقَدْ كُرَّمْنَا بَنِي آدَمَ وَحَمَلْنَاهُمْ فِي الْبَرِّ وَالْبَحْرِ وَرَزَقْنَاهُمْ عَلَى كَثِيرٍ وَوَضَّلْنَاهُمْ عَلَى كَثِيرٍ مِّمَّنْ خَلَقْنَا تَقْضِيلاً (70)}

وصدق الله العظيم سورة الاسراء

### **Dedication**

To ...

Soul of My Father **Who Always Supported Me** My Mother Who took Care of Me Kindly My Brothers and Sisters Who were Always Helpful My Wife Who always loved Me My Son Who always shining above The clouds and storms of this life My Friends Who are Always beside Me

#### **ACKNOWLEDGMENT**

In the name of Allah, Most Gracious, and Most Merciful

Praise be to Almighty Allah (Subhanahu Wa Ta'ala) who gave me the courage and patience to carry out this work. Peace and blessing of Allah be upon his last prophet Mohammed (Sallulaho-Alaihe Wassalam) and all his companions (Sahaba), (Radi-Allaho-Anhum) who devoted their lives towards the prosperity and spread of Islam.

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#### **Abstract**

Transmission lines, among other electrical power system components, suffer from unexpected failures due to various random causes. These failures interrupt the reliability of the operation of the power system. When unpredicted faults occur protective systems are required to prevent the propagation of these faults and safeguard the system against the abnormal operation resulting from them. The functions of these protective systems are to detect and classify faults as well as to determine the location of the faulty line when a fault is detected in the voltage and/or current line magnitudes. Once the fault is detected and classified the protective relay sends a trip signal to a circuit breaker(s) in order to disconnect (isolate) the faulted line.

The features of neural networks, such as their ability to learn, generalize and parallel processing, among others, have made their applications on many systems ideal. The use of neural networks as pattern classifiers is among their most common and powerful applications.

This thesis presents a back-propagation artificial neural network architecture approach to detection, classification and isolation (location) of faults in transmission line systems. The objective is to implement a complete scheme for distance protection of a transmission line system. In order to perform this goal, the distance protection task is subdivided into different neural networks for fault detection, fault identification (classification) as well as fault location in different zones.

### الملخــــص

تعاني خطوط نقل القدرة الكهربائية كباقي مكونات نظام القدرة من الاعطال نتيجة لاسباب متنوعة ومختلفة.

تؤثر هذه الأعطال علي كفاءة عمل منظومة القدرة الكهربائية. عندظ هور الاعطال الغير متوقعة فان نظم الحماية مطوبة لمنع انتشار هذه الاعطال وحماية النظام من العمليات الغير طبيعية الناتجة عنها.

إن وظيفة نظم الحماية إكتشاف وتصنيف هذه الأعطال بالاضافة الى تحديد مو قع الخط المعطل عند اكتشاف العطل من قيمة مطال موجة الجهد او التيار في الخط. بعد اكتشاف العطل وتصنيفه فإن مرحل الحماية (Protective Relay) يرسل اشارة قطع (Signal) لو قاطع الدائرة (Circuit Breaker) لعزل الخط المعطل.

إنَ خصائص الشبكات العصبية الاصطناعية (Artificial Neural Networks) كم قدرتها علي التعلم والتعميم والمعالجة المتوازية من بين الاخريات جعلت تطبيقها علي العديد من الانظمة مثاليا. كما يع تبر استخدام الشبكات العصبية الاصطناعية كذمط للتصنيف من التطبيقات الشهيرة والفعالة.

إن هذا البحث يستعرض استخدام خوارزمية الانتشار العكسي (Architecture Back Propagation) كنهج لإكتشاف الاعطال وتصنيفها وتحديد مو قعها في خطوط نقل القدرة الكهربائية. الهدف من هذا البحث تنفيذ مخطط متكا مل للوقاية المسافية (Protection) لخطوط نقل القدرة الكهربائية. ولتحقيق هذا الهدف قسم مخطط الوقاية المسافية الى عدة دوائر عصبية اصناعية لاكتشاف الاعطال وتصنيفها وتحديد موقع العطل من عدة مواقع.

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### **LIST OF ABBREVIATIONS**

-	Artificial Neural Networks
-	Neural Net
-	Back Propagation
-	Kirchhoff's Voltage Low
-	Kirchhoff's Current Low
-	Per Unit
-	Single-Line-to-Ground fault
-	Line-to-Line fault
	- - - - - -

2LG Line-to-Line-to-Ground Voltage Transformer Current Transformer VT CT

Over Current OC

Miniature Circuit Breaker MCB

RMS

Root Mean Square
Institute of Electrical and Electronics Engineers **IEEE**