

A
Project Report
On
**Detection And Location Of Fault In Underground Cable Using Matlab
Simulink**

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COMMUNICATION ENGINEERING**

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DECLARATION

We declare that the work presented in this report titled “**Detection and Location of Fault in Underground Using MATLAB Simulink**”, submitted to the Department of Electrical Electronics & Communication Engineering, Golgotha’s University, Greater Noida, for the Bachelor of Technology in Electrical & Electronics Engineering is our original work. We have not plagiarized unless cited or the same report has not submitted anywhere for the award of any other degree. We understand that any violation of the above will be cause for disciplinary action by the university against us as per the University rule.

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CERTIFICATE

This is here to certify that the project titled “**Detection And Location Of Fault In Underground Using MATLAB Simulink**” is the benefited work carried out by Ayush Sharma and Sneha Kumari students, during the academic year 2020-21. We approve this project for submission in partial fulfillment of the requirements for the award of the degree of Bachelor of Technology in Electrical & Electronics Engineering, Galgotias University.

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ABSTRACT

Transmission lines are the backbone of electrical power systems and other power utilities as they are used for transmission and distribution of power. Power is distributed to the end user through either overhead cables or underground cables. In the case of underground cables, their propensity to fail in service increases as they age with time. The increase in failure rates and system breakdowns on older underground power cables are now adversely impacting system reliability and many losses involved. Therefore, it is readily apparent that necessary action has to be taken to manage the consequences of this trend. At any given length of a cable, its deterioration or indication of failure manifests itself through discrete defects. Identification of the type of defects and their locations along the length of the cables is vital in order to minimize the operating costs by reducing lengthy and expensive patrols to locate the faults, and to speed up repairs and restoration of power in the lines. In this study, a method that combines wavelets and neuro-fuzzy technique for fault location and identification is proposed. An up to 20 km, 50Hz power transmission line model was developed and different faults and locations simulated in MATLAB/SIMULINK, and then certain selected features of transformed signals were used as inputs for training and development of the ANN. The ANN technique is accurate enough to be used locating underground power line faults.

Keywords: ANN, Fault location, and Underground cables, Transformer

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Chapter 1. INTRODUCTION

GENERAL

In electrical power system, transmission and distribution lines are significant connections that achieve the progression of administration from the producing plants to the end clients. Electrical force can be circulated to the end client through either over-head links or underground links. The principle objective of the associations is to give power in a protected, solid and lovable route to the end client. This is accomplished by keeping up a solid voltage level, amending the force factor through utilization of receptive pay and oaring as near ceaseless help as conceivable so as to fulfill need.

In the previous decade, power request has expanded quickly in metropolitan zones. Everywhere throughout the world, enormous scope underground force link establishments systems are supplanting overhead transmission lines because of ecological worries in thickly populated zones. Underground links are generally utilized in appropriation frameworks since they are more secure than overhead lines and can't be harmed by lightning or tempests. Underground link frameworks are produced to have long existence with unwavering quality. In any case, the valuable life expectancy of these links isn't in nite[1].Mashikian and Szatkowski, [2] featured that as these underground links age, their affinity to bomb in administration expands, in this way at some random length of a link, its crumbling or signs of disappointment shows itself through discrete deformities. Most link producers have evaluated the life of underground link frameworks introduced in the scope of 30 to 40 years. Today, an enormous bit of underground links is towards the finish of their plan life, and the frameworks arriving at the finish of their dependable help life. Because of the mature age of the links, the expanding disappointment rates and framework breakdowns on these more established frameworks are presently antagonistically affecting framework unwavering quality. Along these lines, it is promptly evident that vital move must be made to deal with the results of this pattern [3]. Complete substitution of old or bombing link

framework isn't an alternative since link frameworks don't age consistently. Underground link issues might be in type of arrangement blames in which the link is cut without the electrical protection being broken, or shunt blames in which a break in the electrical protection happens without the conveyor itself being cut. Studies have indicated that one of the most widely recognized shortcomings that prompts disappointment in under-ground power links is the high impedance issue (HIF). In this kind of issue, there is no generous increment in current since the high impedance confines the flow of issue current rendering it more difficult to recognize [4]. For an underground link, the HIF is ordinarily brought about by protection abandons that open the direction to non-leading components. HIF is a case of a beginning deficiency. Early Faults happen because of the progressive maturing process and would regularly degenerate into changeless shortcomings. Altamirano et al, [3] further explained that early blames form into perpetual blames because of electrical over pressure along with mechanical decay, negative natural conditions and substance contamination, which causes lasting and irreversible harm on the protection. To improve the unwavering quality of a conveyance framework, precise distinguishing proof of a blamed portion is required so as to lessen the interference time during issue. Hence, a fast and precise issue recognition technique is required to quicken framework rebuilding, decrease blackout time, limit money related misfortunes and essentially improve the framework dependability and guarantee client influence quality. Some strategies that have been utilized for distinguishing and finding the link defects, were tedious and episodic. This prompted the presentation of better strategies of deficiency distinguishing proof, for example, Time Domain Reflectometer (TDR), Discrete Wavelet Transformation (DWT) and man-made intelligence-based techniques. However, so as to additionally improve the force unwavering quality and decrease in power blackouts, more research should be done to precisely identify the issue area. The speedy reclamation of intensity is fundamental for solid activity of intensity system gear and consumer loyalty. This investigation planned for building up an underground link deficiency recognizable.

1.1 BACKGROUND

Present day society depends vigorously upon perplexing and across the board electric matrices for basic assistance capacities, for example, human services, transportation, family warming and cooling, and modern assembling to give some examples. As our vitality conveyance frameworks (electric and other) age, catastrophic events and man-made bothers are relied upon to undermine lattice honesty all the more regularly. Moreover, urban foundation vitality conveyance systems are exceptionally dependent on the electric framework and thus, the helplessness of foundation systems to electric matrix blackouts is turning into a significant national concern. Electricity transmission is that the mass improvement of power from a creating site, for instance, a power plant, to an electrical substation. Basically, an electrical grid is an interconnected gadget for conveying power from makers to customers. It incorporates of manufacturing stations that produce electricity, excessive voltage transmission traces that convey power from a way off sources to request focuses and appropriation traces that associate person clients or organizations. Transmission strains are a huge bit of the electrical allotment framework, as they give the gratitude to move power among age and weight. Transmission follows work voltage ranges from 100kV to 1000kV and are during an ideal worldwide immovably interconnected for reliable action. As of late, superior sensors, clever automation, hierarchical control, conversation networks, and operations technologies (OT) are integrated into the electrical grid to boost its overall performance and efficiency. These new OT gadgets afford massive quantities of knowledge from several grid systems and transmitting needed data to operations employees during a timely way that couldn't be envisioned while previous generation and transmission systems are designed and constructed decades ago.

Lately, power quality has become a principal worry in power framework building – with 85-87% of intensity power flaws happen on circulation lines [1]. In any case, the flaws that happen on the transmission lines (the transmission grid) however less have a progressively critical and across the board sway on the purchasers. The introduction of a power structure is impacted by blemishes on

transmission lines, which achieves brings about interference of intensity stream. As the force transmission arrangement (organize) turns out to be progressively staggering quick recognizable proof of lacks and exact estimation of imperfection zone is fundamental. The quick dispatch of fix and reclamation of flexibly voltage is basic for limiting neighborhood and local financial effects, lessening by and large force blackouts and improving consumer loyalty. At the point when a deficiency happens in transmission line, it starts a change condition. Transmission insurance frameworks are intended to recognize the circumstance of flaws and segregate just the blamed area of the system. The key test to the link assurance lies in dependably recognizing and secluding issues bargaining the security of the framework – with critical exactness. With the advent of OT devices, new measurement devices like phasor measurement unit (PMU), Digital Fault Recorders (DFR) are often used to provide detailed information on the health the grid. These OT advances in power system has led to massive volumes of data from the continuous monitoring of transmission lines. The massive volumes of data are both a blessing and curse- large amounts of data easily can overwhelm storage facilities, but with the advent of machine learning algorithms this opens potential to implement smart and robust fault location algorithms [2].

1.2 POWER TRANSMISSION NETWORKS

The United States' mass electric system comprises of in excess of 360,000 miles of transmission lines, including roughly 180,000 miles of high voltage lines, interfacing with around 7,000 power plants [4]. High-voltage (up to 765 KV) transmission lines transport power significant distances substantially more productively than lower voltage (12 - 34.5 KV) dissemination lines for two primary reasons. To begin with, high-voltage power transmission takes into consideration lesser resistive loss in travel which is about 6% on normal in the United States [5]. This effectiveness of high voltage transmission takes into consideration the transmission of a bigger extent of the created capacity to the substations and thus to the heaps, meaning operational cost reserve funds. Second, raising the voltage to bring down the current permits one to utilize littler conductor sizes, or have more conductor capacity available for growth. Transmission line system transfer the force from creation destinations to the clients. Failure of these structures can prompt force cuts and subsequently disturb the everyday existence of individuals just as the businesses subject to power.

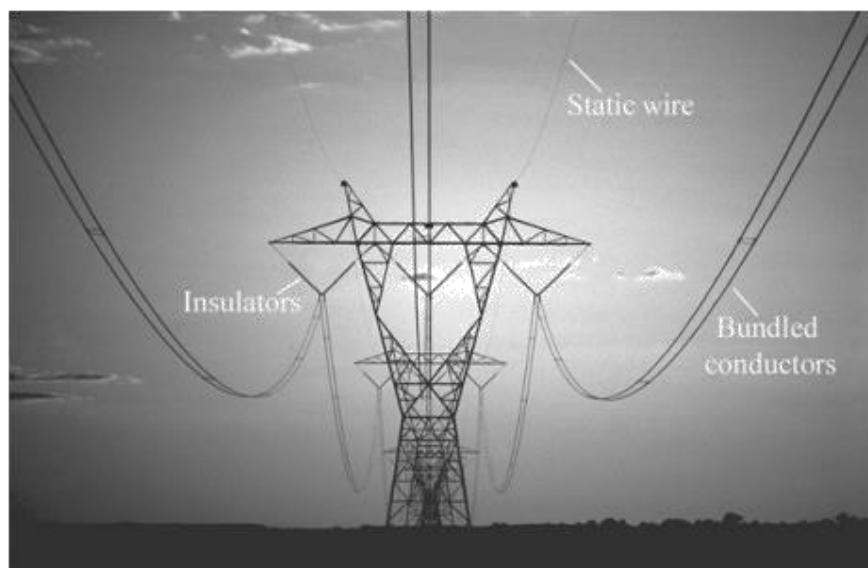


Figure 1.2: Transmission Network

Transmission lines are either overhead electrical cables or underground power links. Overhead links are not protected and are defenseless against the climate however can be more affordable to introduce than underground force links. Overhead and underground transmission lines are made of aluminum amalgam and fortified with steel; underground lines are commonly insulated. Figure 1.2 shows a three-stage 500 kV transmission line with two conductors for every stage. The two conductors per phase option is called bundling. Different conductors are packaged together per stage to twofold, triple, or more noteworthy to expand the force transport ability of an electrical cable, lower misfortunes and improve other working attributes of the line, for example, electromagnetic fields and discernible clamor. Regularly, there are three kinds of line setups utilized in the transmission network. These line arrangements incorporate (a) spiral (1-terminal), (b) 2-terminal, and (c) more than 2-terminal of which three-terminal is potentially the most noticeable multi-terminal sort. The force sources are either generators or what could be compared to a connected arrange. As shown in Figure 1.3, the three terminals are associated through a Tap-point T which doesn't contain any estimating gadgets. Assurance frameworks resemble that of two-ended lines aside from with increasingly modern methods. Much of the time, a current two-terminal line is changed over to three-terminal line as a major aspect of program to strengthen the force framework. At any rate one (for the most part two) communications-based protection groups are normally used with three-terminal line applications.

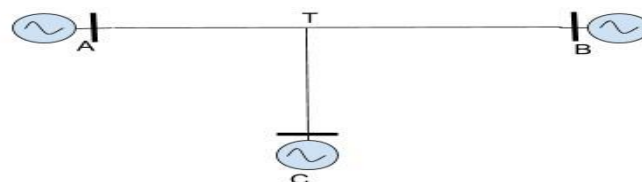


Figure 1.3: Three-terminal Transmission Lines

Two-terminal line system are utilized for mass power transfer and to gracefully stacks from two force sources-Terminals A, B and are normal. Figure 1.4 shows the two-terminal transmission line.

To get legitimate selectivity and coordination, directional separation transfers [6] for stage and ground flaw discovery are utilized regularly. Directional ground over current transferring is once in a while applied addition to, or instead of, directional ground separation transfer capacities. A couple of communications-based protection groups are regularly utilized with two-terminal line applications at the transmission voltages more than 200KV.



Figure 1.4: Two-terminal Transmission Line

Outspread lines are covering that supply loads from single power source-Terminal An as shown in Figure 1.5. No directional overcurrent or distance relays are typically used to ensure these kinds of lines. Communication-based tripping isn't commonly important



Figure 1.5: Radial Configuration

1.4 MOTIVATION

Underground cable faults lead to genuine interruptions of intensity flexibly and numerous misfortunes to both the buyer and the influence utility. The vast majority of the underground link shortcomings acting the system are because of maturing and persistent weakening of link characteristics and properties along the length of the link. So as to enhance the quality, availability and reliability of power, there is need of developments to build the exactness of shortcoming recognizable proof and area on system which are at present being utilized. When all is said in done, the ever-expanding failure rates and system breakdowns on more seasoned underground power links are presently antagonistically affecting system unwavering quality and the failure in question; along these lines, it is promptly evident that fundamental move is made to deal with the outcomes of this pattern. Having the option to precisely find the flaw area won't just assistance the influence utility to set aside cash and time in packing the inquiry in wrong areas yet it will likewise help lessen influence blackout time to the purchasers and set aside cash to the utility. The force utility can know the specific area of the issues empowering them to set up the buyers for conceivable force blackout. The security viewpoint is improved because of the presentation of legitimate area estimation components. This examination proposes a creative procedure in flaw distinguishing proof and area in underground power cables dependent on the ANN method.

1.5 PROBLEM STATEMENT

Transmission lines or transmission organize is a vital piece of the electric matrix as it conveys high voltage power from producing site to the substations where the voltage ventured down for end-use utilization shipped by means of dissemination lines. Though the frequency of faults is much higher in distribution lines, issues on transmission lines have more widespread impact, faults in buried transmission lines take more time to locate then repair. Additionally, since the transmission lines carry high voltages, blames on these lines may prompt dangerous conditions. That is the reason, shielding against uncovered flaw is the most basic undertaking in the security of intensity framework. The protection schemes or mechanisms for the transmission lines become challenging as configurations of the overhead lines becoming complex.

Primary and biggest challenge with protecting three terminal circuits is “Infeed”. During a flaw on the conductor, separation transfer estimates impedance which is sufficient to the positive grouping (A fair three-stage framework with the indistinguishable stage succession in light of the fact that the first arrangement), if there aren't any sources of fault current on the conductor between the road terminal where the relay is found and therefore the fault.

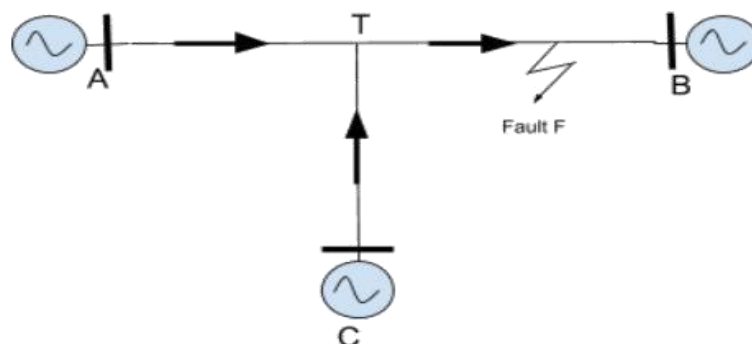


Figure 1.6: Infeed Effect at Three-terminal

From the Figure 1.6, the actual line impedance from the transfer (Terminal A) to the issue isn't generally the impedance estimated by the hand-off. This is on the grounds that the third line (Terminal C) tapped (Tee highlight) a line is an extra wellspring of current for a line fault. Current

will be provided to say the least that happens on the line area past the tap of Terminal C through both Terminal an and Terminal C. The voltage drops coming about because of the contribution of deficiency current from every one of these sources into the basic area of the line will be estimated by the separation transfer at the Terminal A. Since the present contribution from Terminal C isn't applied to the hand-off at Terminal A, the impedance estimated by this transfer is higher than the real impedance from the Terminal A to the fault. The relay will under come to; that is, for a given hand-off setting the relay doesn't cover a similar length of line it would if the extra current source were absent. Due to in feed, most of the impedance and traveling wave-based strategies are not successful for identifying faults and often give erroneous results [8].

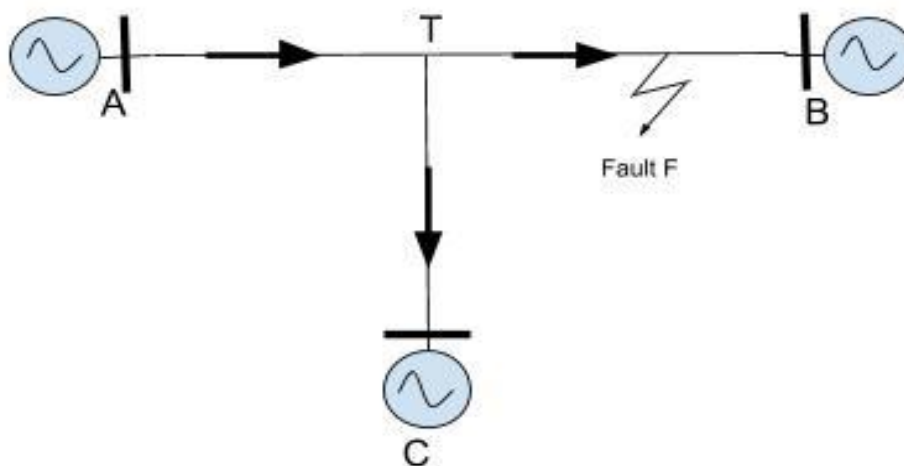


Figure 1.7: Out feed Effect at the three-terminl

It is additionally conceivable to encounter an "Out feed" at the T area, where case there will be inclination to overextend as appeared in Figure 1.7. Thirdly, transmission lines could cross significant distances, in which case the line A-B winds up being in one district and line C-T in various locale with discrete arrangement of natural conditions which straightforwardly impacts the impedance of the individual lines. This causes line non-homogeneity and since impedance on line C-T is distinctive that of line A-B which makes deficiency area on line C-T trickier. Therefore, there is a need of an adaptable, resilient method for fault classification and location on transmission lines which could learn from system behavior and detect unknown faults rather than hardcoded methods (algorithms) which follow specific set of rules. Taken every single together, flaw on transmission lines and the fluctuating ecological conditions present a mind boggling grouping and discovery issue. With the appearance of new AI techniques and managed learning strategies, these difficulties might be all the more adequately tended to. Machine learning method depends on the possibility that system can learn from information, recognize examples and settle on choices with insignificant human mediation. The capacity to consequently apply complex scientific counts to huge information – again and again, quicker and quicker give these calculations potential to recognize bits of knowledge in the information which would be in any case an inconceivable assignment for people. The accessibility of high-goals/high-volume information, because of the multiplication of keen electronic gadgets in savvy matrices, clears ground to actualize progressively exact and wise machine learning methods for fault arrangement and area distinguishing proof on the transmission lines.

CHAPTER 2

2 LITERATURE REVIEW

Given the electrical power grid is a complex power system consisting of power generating stations, high voltage transmission lines and distribution lines, fault classification and location identification is necessary to improve protection mechanisms and have reliable, high-speed protection devices.

Regularly, electrical faults bring about mechanical or material harm to the lines or structures, which should be fixed before reestablishing the line to help. As it is noted previously, fix and recovery is basic for keeping up essential and social organizations. The reclamation procedure is hampered if the area of the fault can't be evaluated with exactness or certainty (not exactly a mile). Various methods have been proposed over the years, and each method have their own merits and disadvantages.

2.1 REVIEW OF THE FAULTS ON THE TRANSMISSION LINE

In an electric force framework, an issue or flaw stream is any unpredictable electric stream. For example, a short out is a blemish wherein current reroutes the customary weight and an open-circuit weakness occurs if a circuit is thwarted by some failure. Transmission line convey 3-stage AC [9]. Under perfect express, all stage voltages have same most extreme esteem yet contrast in stage from one another at edge 120 degrees. Shunt flaws are brought about by hamper lines. For instance, a line to ground flaw happens when one conductor drops to the ground or interacts with the nonpartisan conductor (ground). This causes a fast reduction in particular stage voltage of the line associated with the flaw and increment in stage current. Figure 2.1 shows the stage C-to-ground issue in time (μs)., are the stage voltages of stage a, b, c and, are the stage flows of stage a, b, c separately. From the figure we can see that, size of stage C voltage diminishes and phase current increments during the fault.

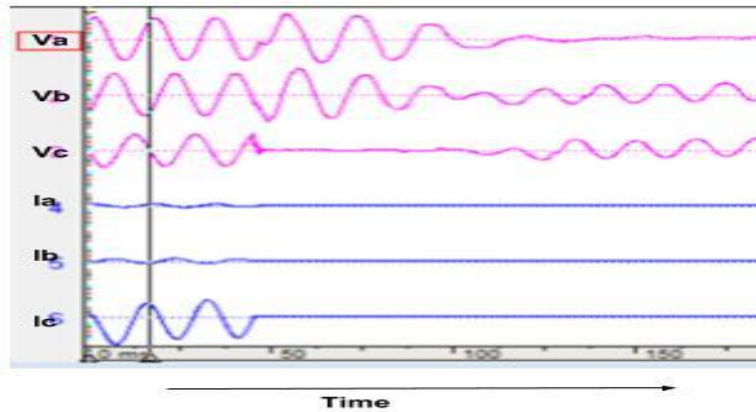


Figure 2.1: Phase to ground fault in time

2.2 SERIES FAULTS

It addresses open conductor and happens when unequal impedance conditions of the lines are accessible. These imperfections upset the equalization in two or three phases and areas such as unbalanced insufficiencies. Instances of series faults are where the framework holds two or three broken lines, or impedance inserted in two or three lines. In reality, a series faults happen, for instance, when circuit breakers control the lines and don't open every one of the three phases, for this situation, a couple of periods of the line might be open while the other/s is shut [10]. Series faults are portrayed by an increment of voltage and recurrence and fall in current in the blamed phases.

2.3 SHUNT FAULTS

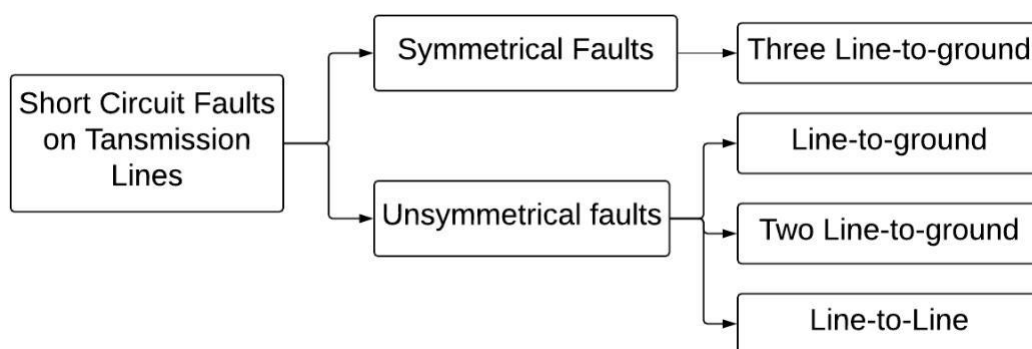


Figure 2.2: Classification of SC faults

These are two kinds of short circuit faults or shunt faults which can happen on transmission lines; adjusted blames and unequal blames otherwise called balanced and unsymmetrical blames separately

as shown in Figure 2.2. In balanced faults, likewise called three stage short-circuits, all the three stages are short-circuited to one another and frequently to earth too. Such faults are adjusted and even as the framework stays adjusted much after the event of the fault. Despite the fact that the balanced faults are uncommon, they by and large lead to the most extreme fault current stream. Most faults that happen in a power framework are unsymmetrical issues including just a couple of stages. The most widely recognized sort of unsymmetrical issue is a short out between a phase and the earth. The shunt deficiencies are the most widely recognized kind of issue occurring in the field. They include power conductors or conductor-to-ground or short circuits between conductors. One of the most significant attributes of shunt deficiencies is the augmentation the present endures and fall in voltage and increment recurrence. Shunt deficiencies can be grouped into four classifications [11].

2.4 LINE-TO-GROUND FAULT:

This sort of issue exists when one time of any transmission lines develops a relationship with the ground either by ice, wind, falling tree or some other occurrence. About 70% of all transmission lines faults are characterized under this class [12].

Line-To-Line Fault: Taking into account breezes, one phase could contact another stage & line-to-line fault occurs. Around 15% of all overhead line's deficiency is seen as a line-to-line issue [12].

Double Line-To-Ground: The tree falling where two phases become in contact with the earth could provoke this kind of issue. Two phases will be incorporated as opposed to one in the line-to-ground shortcomings circumstances. 10% of all overhead line's inadequacies are this sort of faults [12].

Three Phase Faults: For this circumstance, falling pinnacle, failure of gear or even a line breaking and reaching the remainder of the stages can cause three-stage shortcomings. As a general rule, this kind of deficiency not regularly exists which can be seen from a lot of 5% of all transmission lines' shortcomings [12]. The initial three of these shortcomings are known as uneven deficiencies.

2.5 SURVEY OF THE METHODS

This segment presents a study on various fault classification and location identification techniques in transmission lines featuring the used machine learning methods previously. In this review, just short out shortcomings are considered as they are progressively normal.

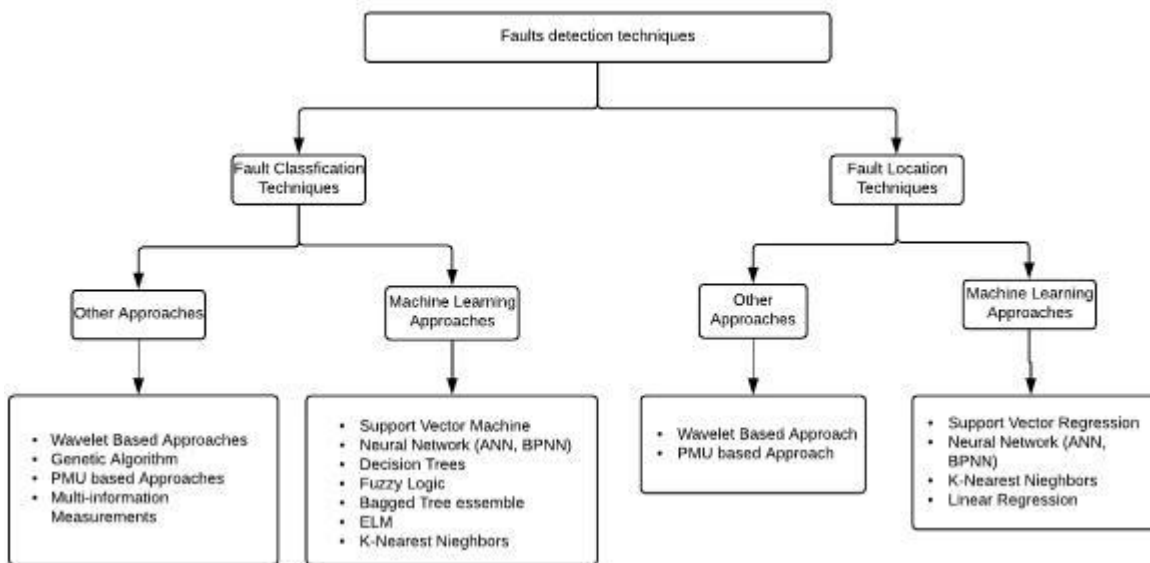


Figure 2.3: Fault detection techniques

The survey is mainly divided into two parts:

Fault classification techniques - Methods that determine the fault type

Fault Location Techniques - Methods that calculate the distance of the fault Both techniques play a vital role in the development of protection mechanisms for a given power system model. There have been different methodologies used to build up a quick speed and dependable strategy to manage blames as appeared in Figure 2.3.

Wavelet-based methodologies basically utilize the time contrast between the voyaging wave reflections which accept higher inspecting rate and synchronized estimations at the terminals for shortcoming ID making it hard for a reasonable application, particularly for three-terminal circuits due to in feed issue. Despite the fact that this strategy has a lower mistake of estimation, it has a

higher computational burden [13]. Phasor measurement unit (PMU) based methodologies require synchronized phasor amounts from all the terminals of the transmission lines. Hereditary Algorithms are the heuristic inquiry and advancement strategies that mirror the procedure of normal development. At the point when applied to order and area blames on transmission lines, they are regularly moderate and complex to be actualized [14].

Machine learning is a subset of artificial intelligence in the field of software engineering that regularly utilizes measurable strategies to enable PCs to "learn" (i.e., dynamically improve execution on a particular task) with information, without being explicitly programmed [15]. Machine learning algorithms can learn and develop themselves by concentrating high volumes of accessible information. They are useful in fields where customary programming rules don't work or rules continue advancing. Since the issues happening on power grid are probably not going to be comparable and power system can change contingent upon the future interest, utilization of AI calculations for taking care of such fault might. They can profit by learning relationship amongst occasions and can give experiences helping human reveal factors causing the deficiencies and to discover the arrangement of complex multi objective nonlinear systems, the above-said techniques are utilized to get quicker arrangement and less mistake.

As shown in Table 1,2 and 3 we are comparing some research paper to identify the methodology they are using.

TITLE	AUTHOR & YEAR	METHODOLOGY	DISADVANTAGES
Underground Fault Distance Locator	Dhekale P.M., Bhise S.S., Deokate N.R. (2015)	This paper proposes shortcoming zone model for underground power connect using microcontroller. The purpose of this errand is to choose the partition of underground connection lack from base station in km. This study uses the essential thought of ohm's law. Exactly when any weakness like short out occurs, voltage drop will contrast dependent upon the length of issue in interface, since the present changes. A great deal of resistors is along these lines used to address the connection and a dc voltage is dealt with toward one side and the issue is recognized by perceiving the change in voltage using a relationship to voltage converter.	Energy loss is high, Stability cannot be achieved.

Table 1

Underground Fault Distance Locator	B.Bhuvneshwari, A.Jenifer, J.JohnJenifer,S.DurgaDevi and G.Shanthi 2006	This study proposes an issue zone model for underground force links using microcontrollers. The purpose of this study is to choose the detachment of underground connection imperfection from the base station in km. This study uses the clear thought of ohm's law. Exactly when any inadequacy like short out occurs, a voltage drop will vary dependent upon the length of the blemish in the interface, since the present movements. Plenty of resistors are in this manner used to address the connection and a dc voltage is dealt with toward one side and the blemish is recognized by distinguishing the modification in voltage using an easy to voltage converter and a microcontroller is used to make the basic.	The circuit complexity increase, it affects the stability.
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Table 2

TITLE	YEAR	METHODOLOGY	DISADVANTAGES
Underground Fault Distance Locator Circuit and Working	2015	<p>Faulty Cable Distance Locator</p> <p>Before attempting to find underground link faults on direct shrouded essential link, it is fundamental to acknowledge where the connection is organized and what heading it takes. If the issue occurs on the discretionary connection, by then understanding the particular course is significantly continuously essential. Since it is difficult to find a connection issue without acknowledging where the connection is, it looks good to pro connection finding and following before start the inadequacy discovering process.</p>	By varying the distance, the stability will disturb

Table 3

2.6 SUMMARY

From the for-going literature review, it is noticed that various strategies for fault identification and area have been proposed. A great part of the work which has been done uses the wavelet concept to distinguish the adjustments in the line parameters. Many researchers worked on this area combining that concept with other technologies such as Fuzzy System, Neural Networks and Bees Algorithm. The aim was to either increase on the accuracy of fault location or speed. In this study, the same concept of Discrete Wavelet Transformation (DWT) combined with ANFIS, was used for the identification of faults in underground cables in a simpler and much faster way but at the same time increasing accuracy of the system. The proposed method utilized how the transmission lines are identified with each other so the distinctions can be utilized to recognize any issue type. Speed and precision were significantly thought of and the framework structured had the option to distinguish the flaw precisely and quick Variety of approaches has been utilized to build dependability and strength of shortcoming characterization and area techniques. Neural Network follows a discovery black box model making the explanation for the result typically difficult to understand. Neural system-based fault classification methods show great precision; be that as it may, the preparation time is very huge because of which the assignment turns out to be progressively mind-boggling. The counterfeit neural system methods experience the ill effects of the prerequisite of huge preparing information. In any case, these methods are difficult to execute basically. In the event that the flaw can't be distinguished rapidly, it will create some evil impacts, for example, line blackouts during the time of pinnacle load prompting serious economic losses. There may be a chance for the entire grid to collapse which is called as blackout and the reliability of the system would be affected. Few of the fault classification and location methods use fuzzy logic-based architectures [13]. Fuzzy logic uses rule-based relationship for making decisions. Though they have lot less calculation trouble, it is dreary to create fluffy standards and participation capacities and fluffy yields can be deciphered from multiple points of view making examination troublesome. Furthermore, it requires

parcel of information and ability to build up a fluffy framework. Other impedance estimation-based techniques for fault area rely upon basic idea of computing line impedances pre-and present blames on decide the separation of the fault. However, in three terminal circuits, due to in feed, the impedance values are estimated are a lot bigger than actual line impedance which offers ascend to erroneous results. Secondly, the lines A-B and C-T may be in different terrains which results in different environmental conditions. In this scenario, synchronized impedance measurements might provide erroneous results. It shows up, Current best in class Machine Learning strategies introduced in above segments have tried models on mimicked information which have same circulation, design/pattern as preparing information. In this manner, the vigor of the method isn't totally known and the topic of whether these techniques are pertinent to 3 terminal systems is yet to be replied.

CHAPTER 3

3 METHODOLOGIES

Fault recognizable proof was exhausted post fault conditions. For the framework to detect the fault in post fault conditions, the fault was expected to possess happened as of now when the reproduction was started. The character of the fault and in this manner the detail of the fault were changed inside the three-phase fault tool compartment. This permits the framework to claim contrasting sorts of fault and at various areas to shroud wide situations which could influence the rigging instrument. Since transmission lines can encounter a single line or twofold phase or 3 phase faults, the faults were additionally presented at these various areas with various practices. Within recent past, many researchers have proposed approaches for fault classification and site identification. However, they weren't applicable to a spread of transmission network configurations, particularly terminal networks and weren't evaluated with real data to make sure the effectiveness of the methods in locating and classifying faults on the line.

In the recent past, researchers have proposed approaches for fault classification and site identification. However, they weren't applicable to a spread of transmission network configurations, particularly 3 terminal networks and weren't evaluated with real data to make sure the effectiveness of the methods in locating and classifying faults on the cable. Supported the literature review and preliminary designs, the planning criteria that emerged is as follows: Scalability. Transmission network expand as the demand for the power increases every year. Therefore, fault location methods should be scalable.

Confidence: Should produce estimates that are timely, sound and reliable, otherwise the boldness within the methods would be weakened and longer lengths of cable would need to be examined to search out the precise fault location. *Network Topology*, Adaptive to different configurations, applicable to changing fault data.

Relevant: Make use of existing power line health data

Extensible: Interface with existing OT line monitoring devices.

Based on recent advances in machine learning, it had been decided to explore the utility and

applicability of machine learning to fault classification and site on transmission lines. Machine learning may be a type of data analysis that automates analytical model building [49]. Using algorithms that continuously assess and learn from data, machine learning algorithms enables hidden insights into complex behaviour and relationships. It can handle multi-dimensional and multi-variable data in dynamic environments. A key aspect to machine learning algorithms is that they learn the behaviour of the system representative and artificial datasets to supply reliable, repeatable decisions and results. For fault classification and site on transmission lines, these attributes are desirable. Additionally, machine learning methods don't require synchronized measurements at the terminals. Additionally, they will be used in real time to watch the grid likewise. Computer file is extremely crucial aspect for the machine learning algorithms and also the correctness of prediction relies on the standard of information that the model was trained with. Post- fault voltage or current transients from the live grid are vulnerable to have touch of noise (may be negligible).

3.2 LOCATION IDENTIFICATION

Once the fault type is classed using the choice tree classifiers, the subsequent step are to spot the road where the fault has occurred. just in case of two terminal conductor, since the system studied has just one line, we skip this step and do the wave-distance method to induce the fault location distance directly. For Three-Terminal (TEED) Circuits, the branch with the fault first has to be identified. Figure 19 shows the Fault Location Identification process for TEED Circuits.

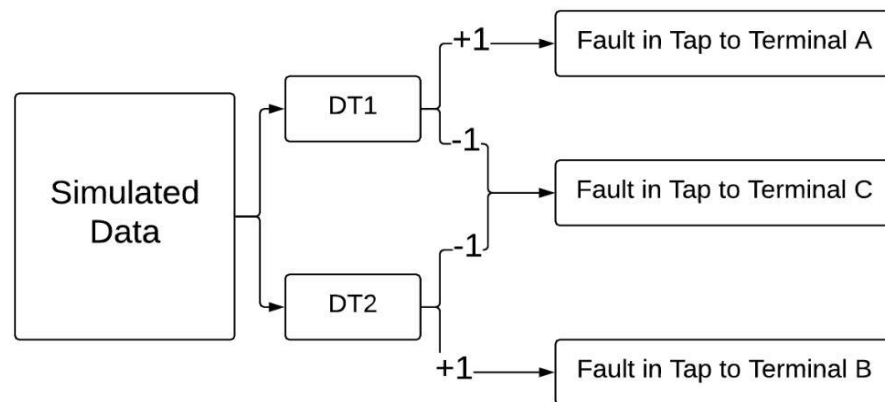


Figure 3.1 Fault Location Identification Process for Three-Terminal Circuits

3.4 ARTIFICIAL NEURAL NETWORKS

The fault location identification process mainly consists of two Decision Tree models which predict whether the fault occurred was in line A-Tap or B-Tap. As shown in figure 3.1 Decision Tree, DT1, predicts +1 for the fault occurrence on line A-Tap and value -1 if not. Second Decision Tree, DT2, makes decision for the road B-Tap. If both the trees have predicted the worth of -1, then the fault has occurred in line C-tap. The simulated data is employed to coach the choice Tree models. Max-depth parameter has been accustomed restrict the tree from over-fitting the training data. Just in case of a fancy system with N lines, N-1 Decision Trees would be accustomed make predictions. The fault location for the 2 terminal circuits don't require previous step as they need just one line and thus fault distance will be calculated as described below.

Due to simple, improved generalized characteristic and adaptive nature, ANN is popularly applied for fault analysis within the TL and DL [36]. a number of the kinds of ANN are described within the section below 3.6.2 Feed-forward neural network (FFNN) the most structure in FFNN are Input, hidden and an output layer as illustrated in Figure. 3.10[95]. Multilayer perceptron (MLP) and back-propagation learning method is employed in FFNN where MLP could be a class of FFNN and contains a minimum of 3 layers of nodes. apart from the input nodes, each node could be a neuron within which nonlinear activation function is applied. The properties of FFNN are multiple layer, non-linear activation function etc. Fine-tuning of the burden and biases of the network in FFNN is required to reduc

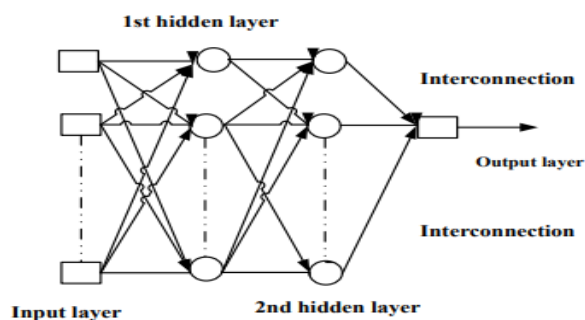


Figure 3.2 Feed Forward Neural Network Structure

3.5 NEURAL NETWORK

ANNs began as a secondary architecture of human mind to perform the difficult type of algorithm with least error. Now they slowly adapt to the methods for problem solving, as each neuron connected to each other's egg: 1 neuron output is input of another neuron. These are connected in various patterns to perform various tasks. By using the process like back propagation we can change the input weight on each neuron to improve efficiency. Every neuron could be a hub that is associated with different hubs by means of connections that relate to natural axon-neurotransmitter dendrite associations. Each connection incorporates a weight, which decides the quality of 1 hub's impact on another. Numerous analysts have utilized a neural system for shortcoming grouping and discovery clarified in [27].

3.17 SOFTWARE DESCRIPTION

MATLAB® may be a high-level technical computing language and interactive environment for algorithm development, data visualization, data analysis, and numerical computation. Utilizing MATLAB, you'll have the option to take care of specialized figuring issues quicker than with customary programming dialects, for example, C, C++, and FORTRAN.

MATLAB could similarly be a data examination and portrayal gadget which has been arranged with momentous help for framework and matrix undertakings. In addition, similar to this, MATLAB has sensational representations capacities, and its own weighty phony language. One of the explanations that MATLAB has become such a vital contraption is through crafted by sets of MATLAB programs planned to support a specific endeavor. These plans of undertakings are called device compartments, and as such, the particular instrument stash critical to us is that the image getting ready toolbox. As opposed to gives a depiction of the sum of MATLAB's capacities, we will restrict ourselves to just those perspectives stressed over the treatment of pictures. We will introduce limits, requests, and methods changing. A MATLAB limit may be a catchphrase that recognizes various parameters, and

makes a yield: for example, a framework, a string, an outline. Trial of such limits are sin, in-read, right forthright. There are various limits in MATLAB, and as we will see, it is incredibly straightforward (and sometimes essential) to put recorded as a printed version of own.

MATLAB's standard data type is that the matrix all data are seen as structures or some resemblance thereof. Pictures, clearly, are networks whose parts are the diminished characteristics (or conceivably the RGB estimations) of its pixels. Single characteristics are considered by MATLAB to be a framework, while a string is just a system of characters; being the string's length. During this, we'll examine the more regular MATLAB requests and discussion about pictures in further parts. At the point when you set out MATLAB, you have an unmistakable window called the Command Window inside which you enter orders. Given the tremendous number of MATLAB's abilities, and besides the different parameters they will take, a request style interface is after all substantially more gainful than a rich course of action of pull-down menus. You'll have the alternative to use MATLAB in an incredibly wide extent of employments, including sign and picture dealing with, correspondences, control arrangement, test and estimation budgetary showing, and assessment. Additional device stash (arrangements of explicit explanation MATLAB limits) loosen up the MATLAB condition to decide explicit classes of issues in these application zones. MATLAB gives a sort of feature to announcing and sharing your work. you will have the alternative to fuse your MATLAB code with various tongues and applications and pass on your MATLAB counts and applications.

Software Requirements:

OS: Windows

Software: MATLAB R2017b

Hardware Requirements:

Processor: Intel Pentium.

RAM: 2GB

3.17.1 THE MATLAB LANGUAGE

This is a significant level lattice/cluster language with control stream announcements, limits, data structures, input/output, and article orchestrated programming features. It grants both "programming inside the little" to rapidly make smart disposable activities, and "programming inside the immense" to outline all out gigantic and present-day application programs.

3.17.2 THE MATLAB WORKING ENVIRONMENT

This is the game plan of mechanical assemblies and workplaces that you basically work with in light of the fact that the MATLAB customer or programming engineer. It recalls workplaces for managing the variables for your workspace and getting and conveying data. It is like manner fuses gadgets for making, supervising, investigating, and profiling M-records, MATLAB's applications.

3.17.3 HANDLE GRAPHICS

This is the MATLAB outlines system. It joins critical level requests for two-dimensional and three-dimensional data portrayal, picture taking care of, movement, and presentation delineations. It similarly fuses low-level requests that grant you to totally re-try the nearness of representations similarly as to create complete Graphical User Interfaces on your MATLAB applications.

3.17.4 THE MATLAB MATHEMATICAL FUNCTION LIBRARY

This is an immense arrangement of computational counts running from simple limits like an aggregate, sine, cosine, and complex number juggling, to logically refined limits like framework backward, grid eigenvalues, Bessel capacities, and quick Fourier changes.

SIMULINK: Simulink might be a reenactment and model-based structure condition for dynamic and installed frameworks, coordinated with MATLAB. Simulink, in like manner made by Math Works, may be a data stream graphical programming language gadget for illustrating, reenacting and separating multi-zone dynamic structures. It's on a very basic level a graphical square outlining

instrument with customizable game plan of square libraries. It grants you to join MATLAB estimations into models further as passage the reenactment results into MATLAB for extra assessment.

Simulink Supports

- system design
- simulation
- automatic code generation
- testing and check of embedded systems
- There are a couple of other additional things gave by Math Works and untouchable hardware and programming things that are available for use with Simulink.

3.18 USING SIMULINK

As you open MATLAB Simulink you find a library of pre-installed library of the usable systems.

Here in this library one can browse anything by going to left side and click on search. After finding the required one click on it to use it as appeared in Figure 3.3, tapping on every one will show the structure hinders on the correct window sheet.

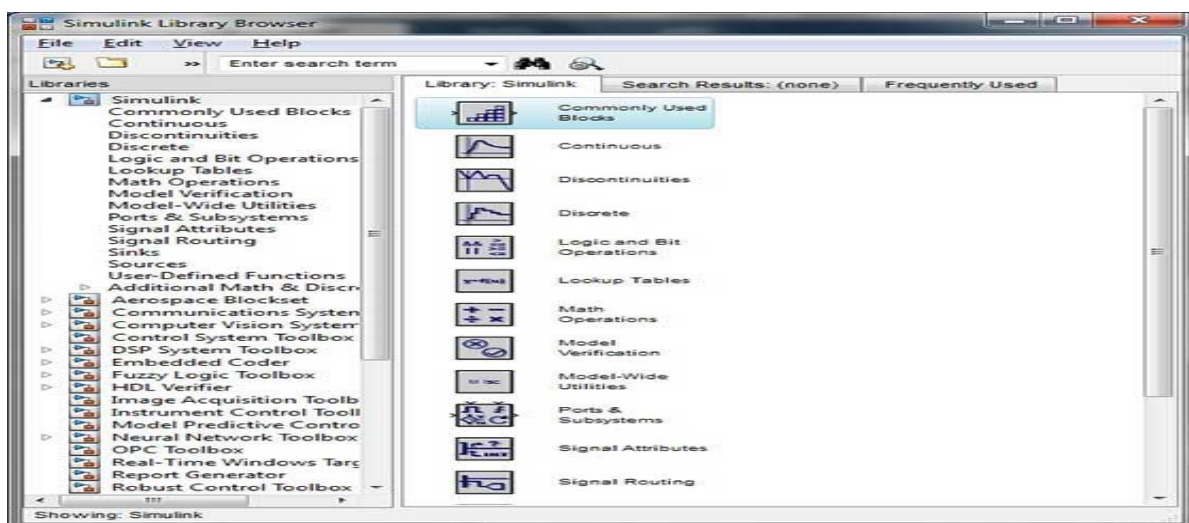


Figure 3.3

To make a new model click on the browser toolbar. This opens a window which has a collection of utility models. As demonstrated in Figure 3.4.

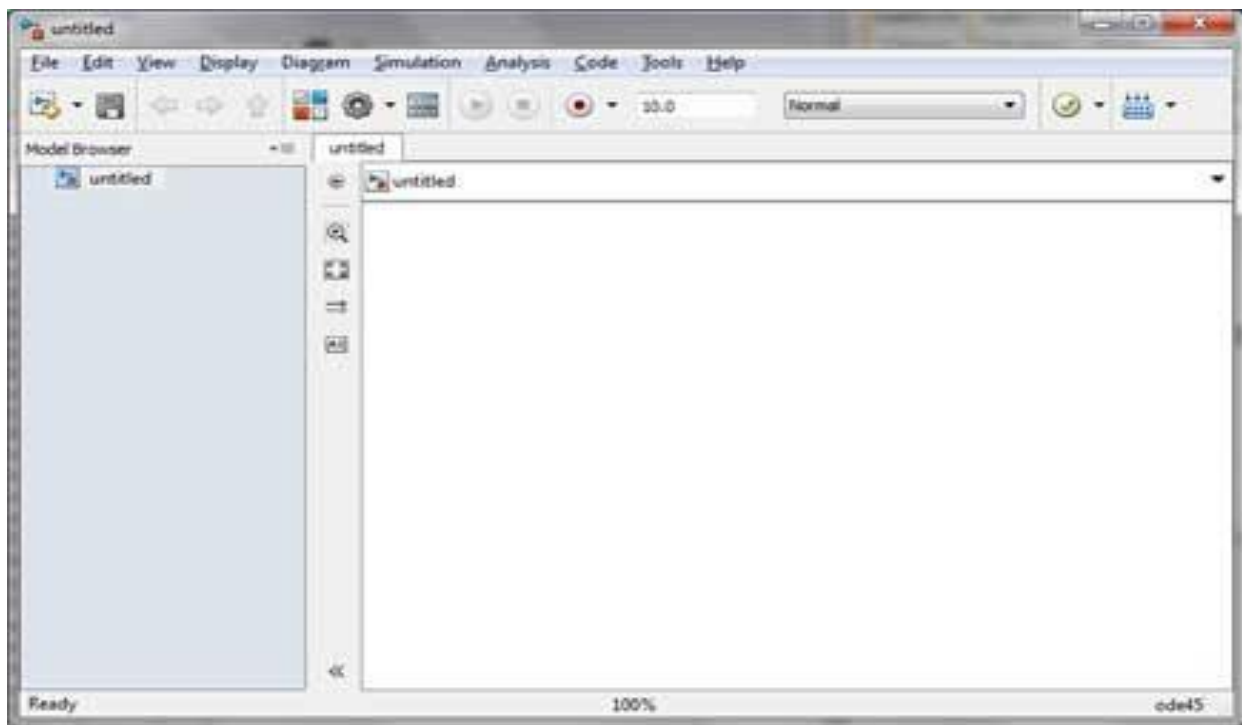


Figure 3.4

By dragging them to the square screen. You can also make duplicates by using copy paste options and then glue them into the model window. As a result we are having two blocks - A Source (a signal generator) and a Sink (a scope) as appeared in Figure 3.5. Here the source is the signal generator signal generator creates a simple signal, and the work of a sink is to represent it graphically,

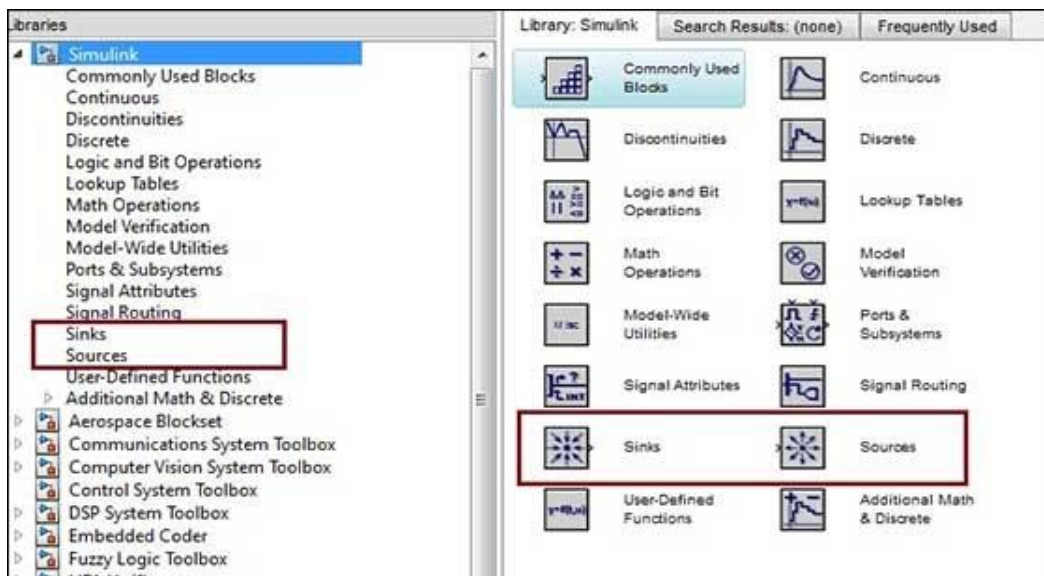


Figure 3.5

Now start dragging required tools from the library. After them collecting in square screen start connecting them . Now drag a 'Sine Wave' tool into the screen as shown in Figure 3.6.

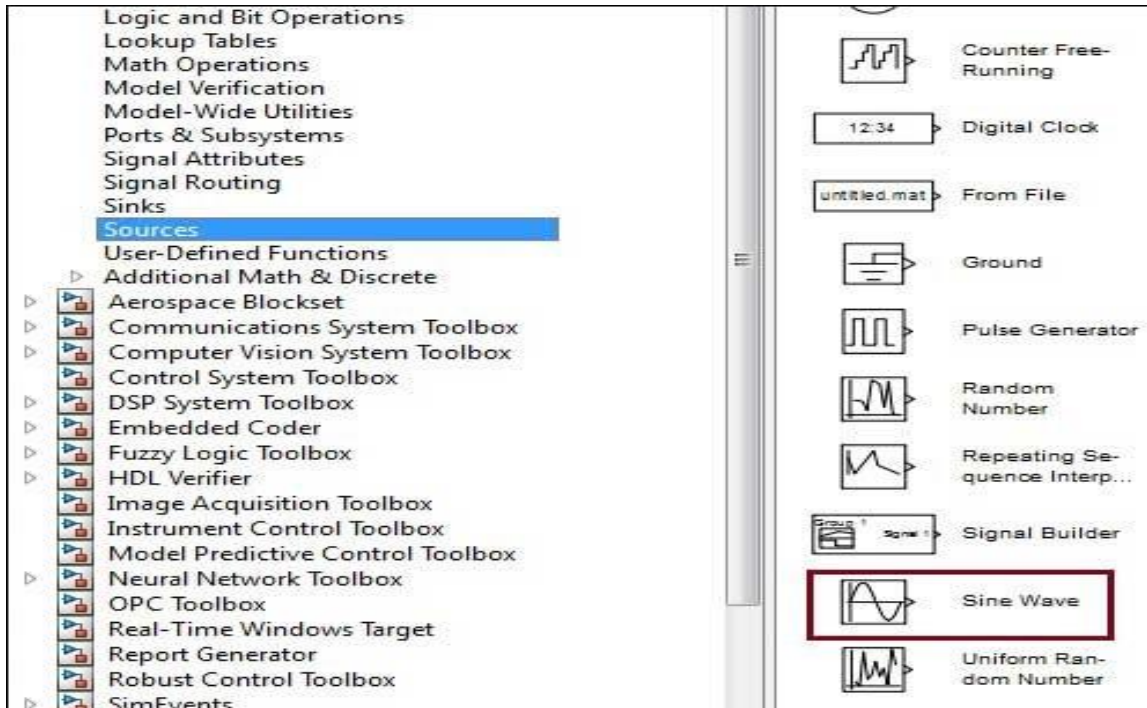


Figure 3.6

As we selected the sine wave generator let us use a sink (a scope) which represents it graphically shown in Fig 3.7.

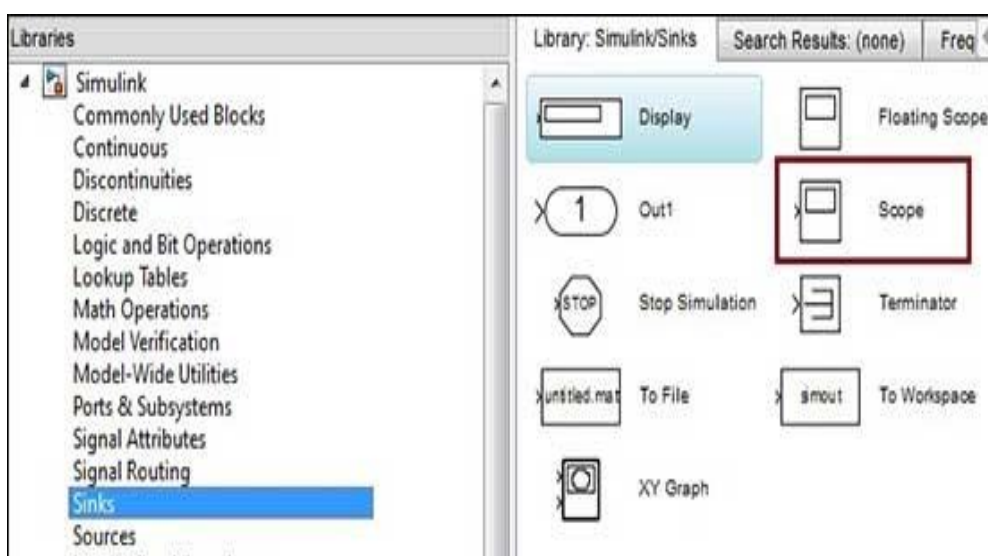


Figure 3.7

Connect the source and the sink using a single line as shown in Figure 3.8.

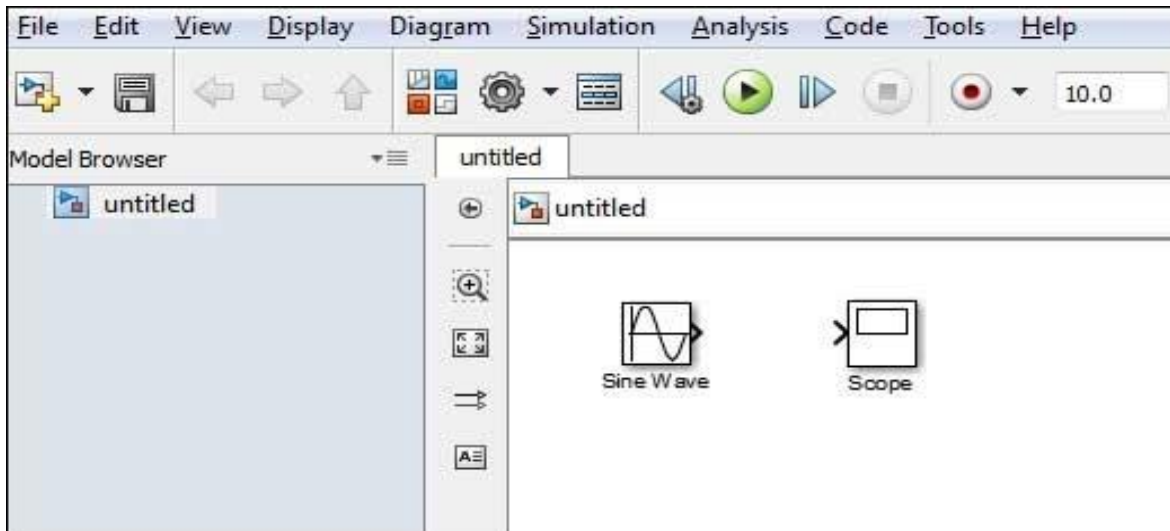


Figure 3.8

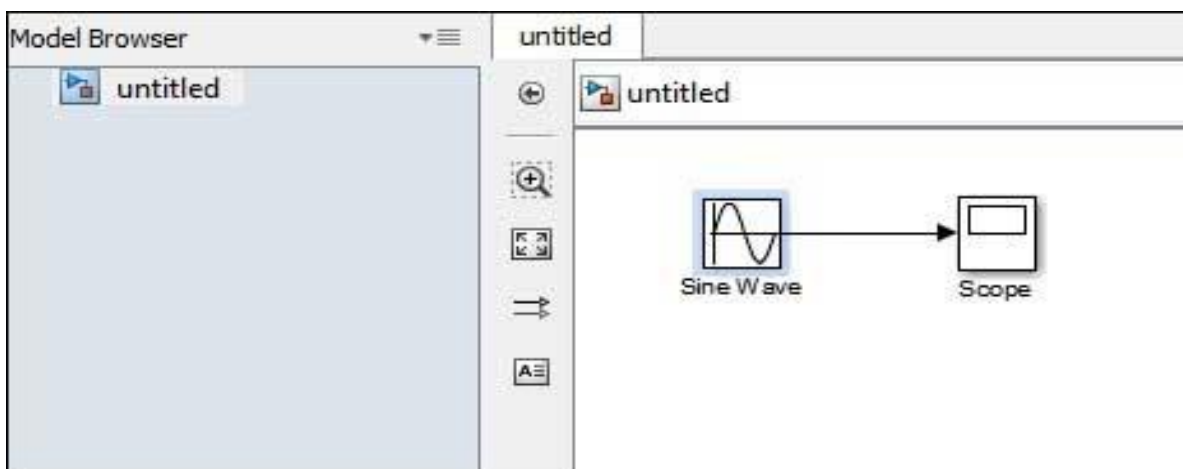


Figure 3.9

We can see all the transmitted signal on scope which are transmitted by sine wave generator by pressing run button and keeping parameters at default as appeared in Figure 3.10.

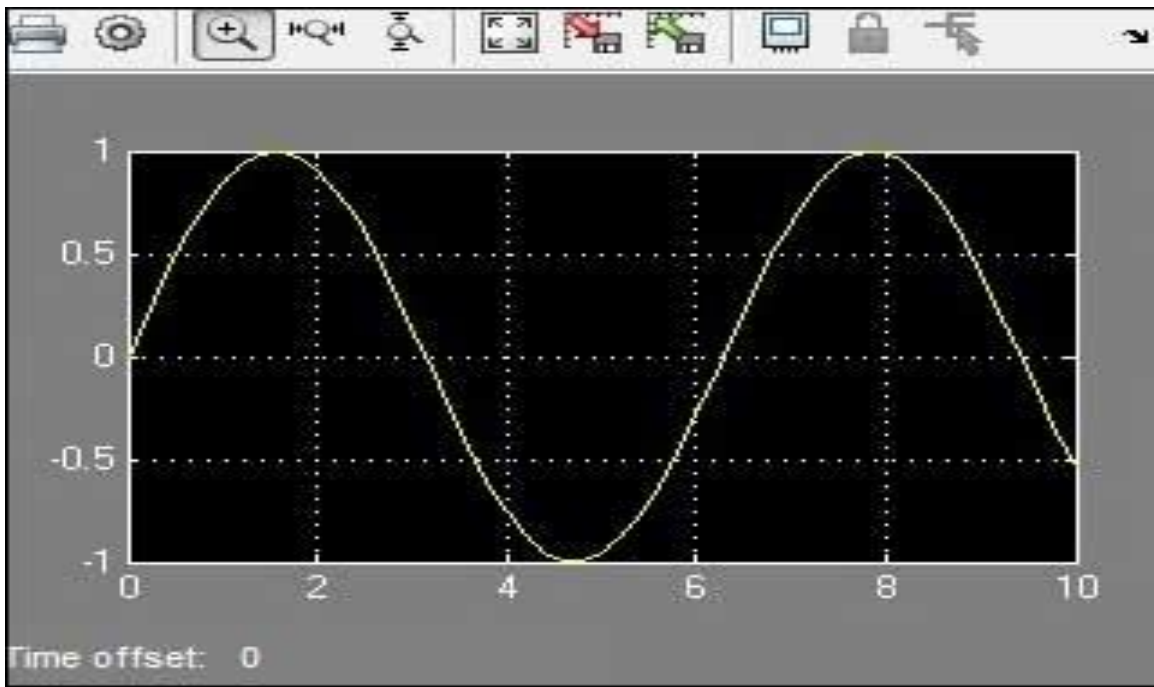


Figure 3.10

As we can see that on the scope sinusoidal wave appears. Who's amplitude lies between +1 to -1 and for the set time period of 10ms. By this process we can verify that or connections are proper as scope shows the desired output.

CHAPTER 4

4 IMPLEMENTATION AND EVALUATION

4.1 PROPOSED SYSTEM

MATLAB software model is modified version of previous one Fundamentally disseminated parameter line has been demonstrated has an underground link. A 1.2 KV, 25 sq.mm fascinated copper link parameter are used. The underground system is of 100 km. at sending and getting closes Fourier squares and degree are utilized to get the natural parts of the voltages and flows at all the issues to be specific line-ground, line-line-ground sort of shortcomings. All the other kind of faults are studied and comparison are made by moving the fault points. If the Fault occurred at any distance we are able to find which Km distance the fault is occurred.

BLOCK DIAGRAM:

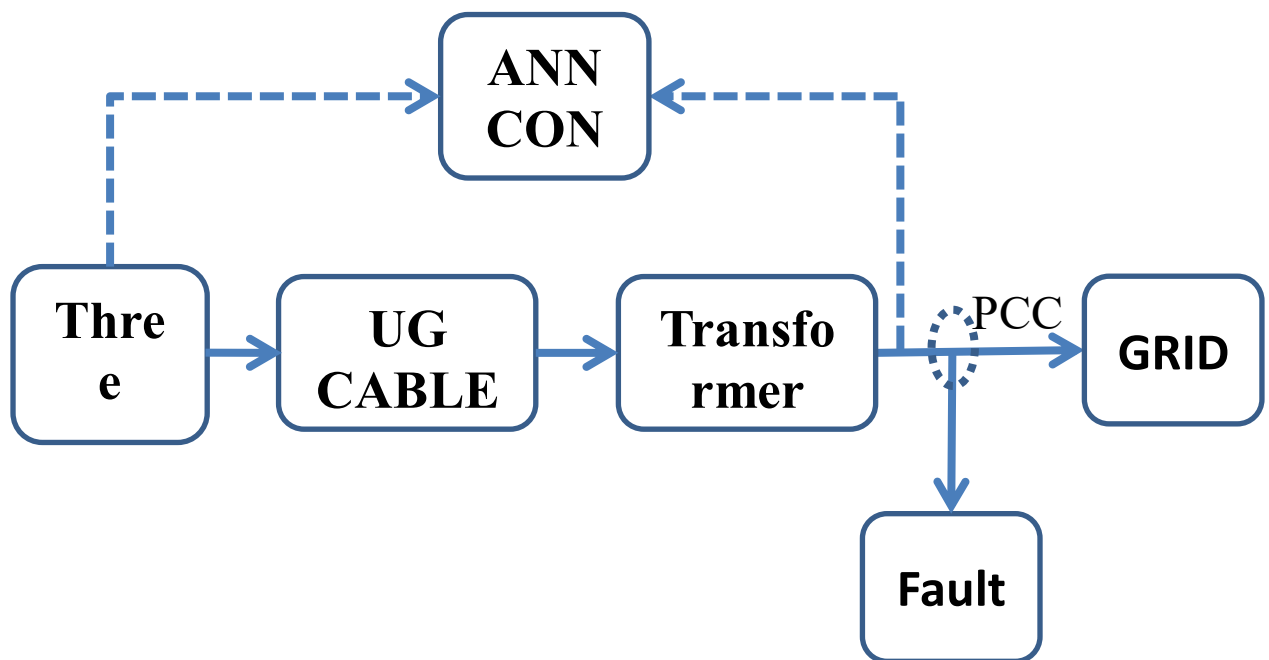


Figure 4.1 Proposed block diagram

4.2 MODULES

- Three Phase Source
- Three Phase Transformer
- ANN
- Fault

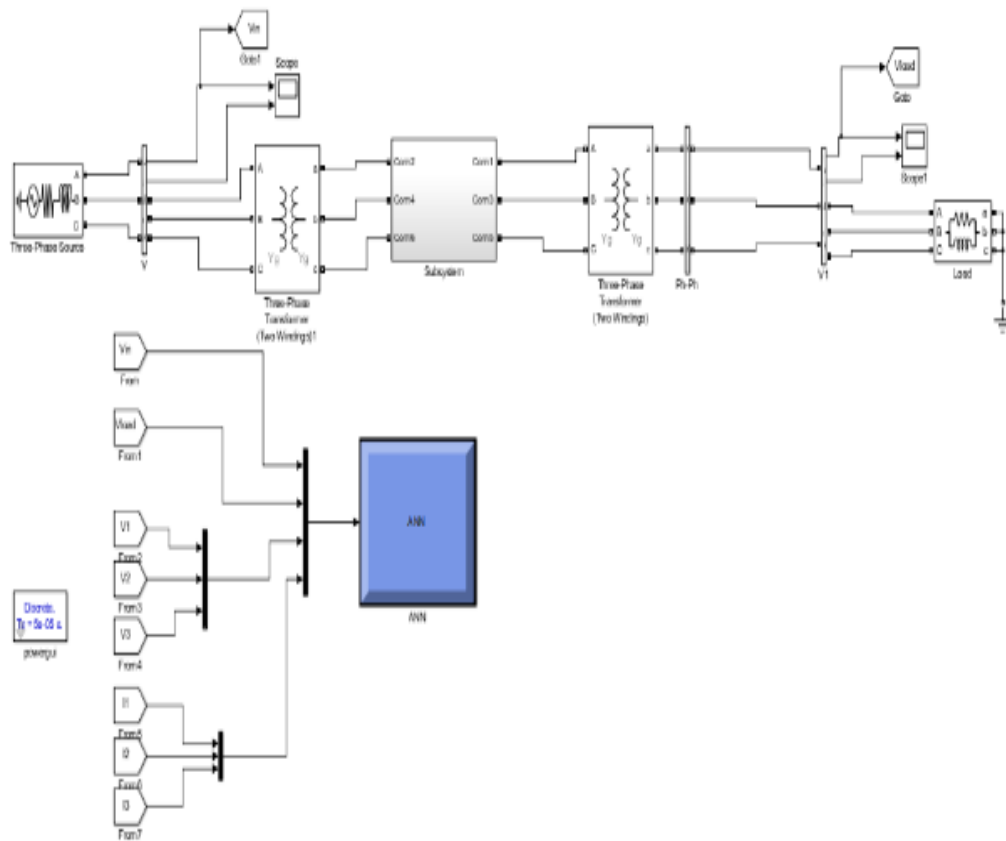


Figure 4.2

4.3 THREE-PHASE SOURCE

Standard Solar, Inc. recently completed one in all the primary solar micro grid in a power supply which is three-phase, electrical energy of the identical frequency and voltage amplitude is carried by three conductors which is relative to a typical reference with a phase difference in $1/3$ of a cycle between each as shown in Figure 4.2. They typically connected with ground and a current-carrying conductor called the neutral, because of the difference in phase, the voltage in any conductor goes to its peak at $1/3$ of a cycle after one in all the not in same phase conductors and $1/3$ of a cycle before the remaining conductor. This delay in phase gives constant power transfer to a linear load. It also possible to provide a rotating magnetic flux in a motor and generate and other phase arrangements using transformers (generally by using a Scott-T transformer).

Advantages: Contrasting with a solitary stage AC power flexibly which utilizes two transmitters (stage and impartial), a three-stage gracefully with no nonpartisan wire so the stage to-ground voltage and current limit per stage can transmit multiple times the most sum power simply utilizing 2 fold the number of wires (i.e., three rather than two). Consequently, the proportion limit of conductor material becomes twice.[4] The proportion of ability to conductor material proportion increments to 3:1 with an ungrounded three-stage and focus grounded single-stage framework. Steady force move, dropping stage flows would be conceivable with any number (more noteworthy than one) number of stages, by keeping up the ability to-conductor material proportion that is multiple times of that of single-stage power. In any case, two-stage power goes through exceedingly less smooth (throbbing) torque in generators or engines, and very three stages confuse.

Phase sequence: Wiring for three phases is every now and again perceived by concealing codes that move by country. The relationship of the phases inside the right solicitation is required to guarantee the arranged direction of the turn of three-phase motors. For example, siphons and fans most likely to exclude switch. Keeping up the character of stages is required if there's any opportunity two sources will be related at the indistinct time; a fast interconnection between two unmistakable stages may be.

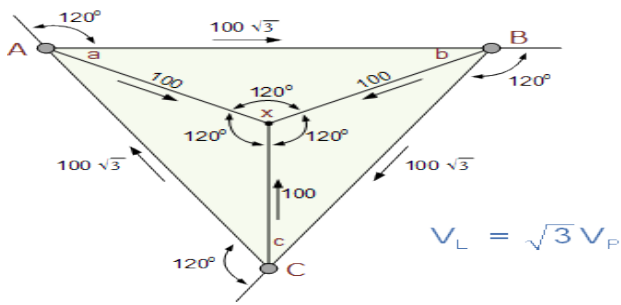


Figure 4.3 Three Phase supply

4.4 3-PHASE TRANSFORMER

Three-stage (3-stage or 3 ϕ supplies) are utilized for electric force age, transmission, and circulation, These provisions have numerous electrical focal points over single-stage flexibly and when talk around three-stage transformers we've three exchanging voltages and flows varying in stage time by 120 degrees as appeared.

In figure 4.3 where V_L shows the line-to-line V and V_P shows the phase-to-neutral voltage. A transformer can't go about as a stage changing gadget or even can't adjust single-stage into three-stage or the other way around. To make the transformer associations which are perfect with 3-stage supplies we've to connect them together in an exceedingly technique. A 3-stage transformer developed either by associating 3 single-stage transformers, as they became three stage transformer banks, or by utilizing one adjusted three stage transformer which have 2 single stage wiring wrapped

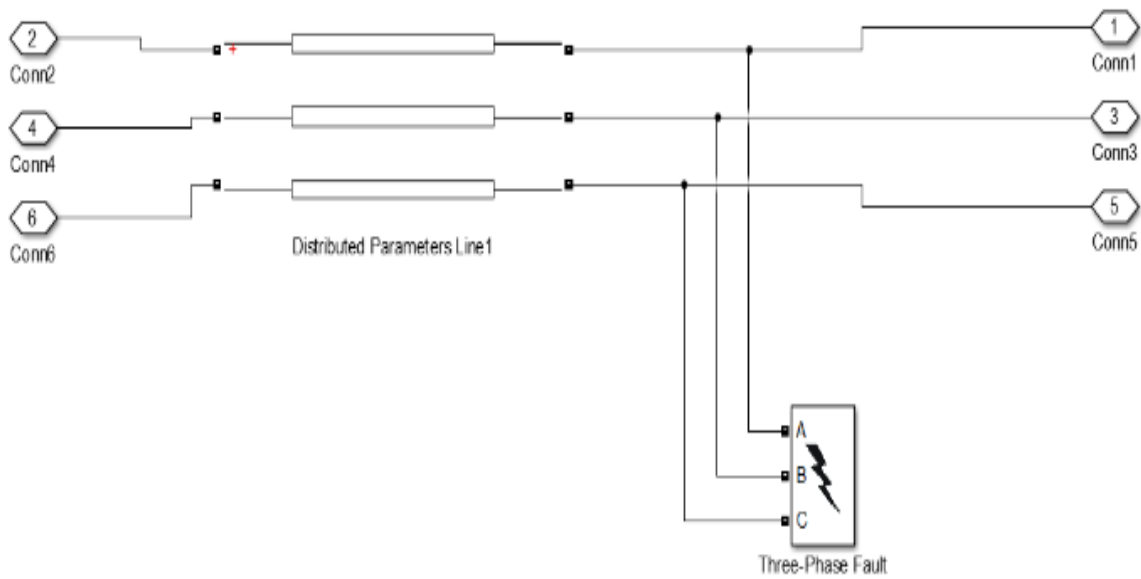


Fig 4.4 Three Phase Voltages and Currents feeder line

The advantages of using a 3-phase transformer instead of single phase of same ratings. Firstly a transformer bank made up of 3 transformers uses more space and bulky. In bank if any one transformer fails the system would not work. Even the copper and iron losses are less in 3 phase transformer. Hence we can say that 3 phase transformer work more efficiently.

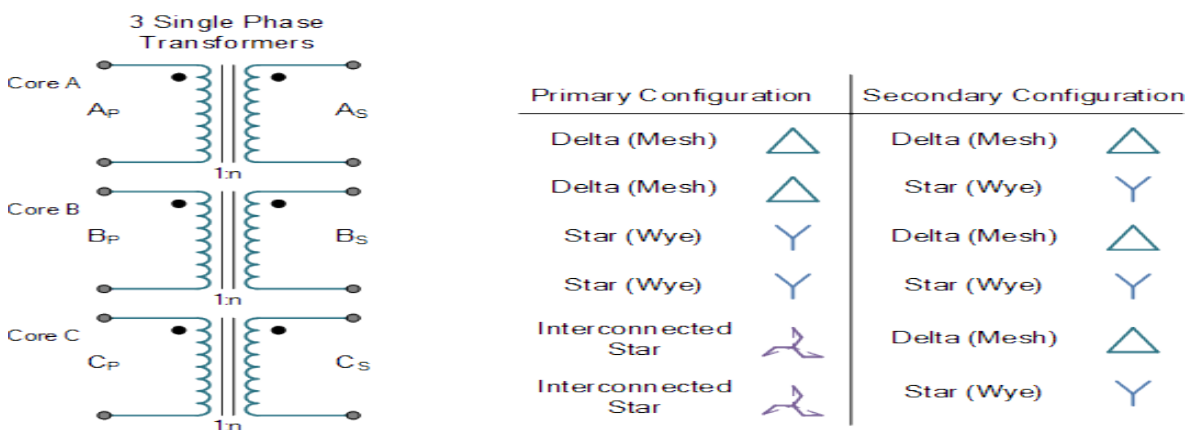


Figure 4.5 Three Phase transformer connection

As appeared in Figure 4.5 the first two winding can be associated in quite a while as needs be to the utilizations however with regards to three stage transformer windings, three sorts of association are

conceivable: "star" , "delta" and (zigzag).The mixes can be varied for essential and optional., waging on the transformers use. At the point when transformers not have at least 3 stages they're commonly known as a Polyphone Transformer. Three Phase Transformer Star and Delta association mean by "star" at essential and delta to auxiliary. This has three arrangements of essential and auxiliary windings. Associations of sets of windings, decides if the association is star or delta arrangement. Accessible voltages, naturally are dislodged from one another by 120 electrical degrees, this kind of electrical associations decide the progression of the transformers flows. While 3 single-stage transformers combined, attractive transitions inside every transformer contrast in stage by 120 time-degrees. Here we utilize a technique where the three essential windings named with capital letters A, B and C. The auxiliary windings are marked with little letters a, b and c. Each winding has two finishes which are named likewise, for instance the second twisting of the main closures we named it with B1 and B2 and the third twisting of the optional are named as c1 and c2 as appeared in Figure 4.6.

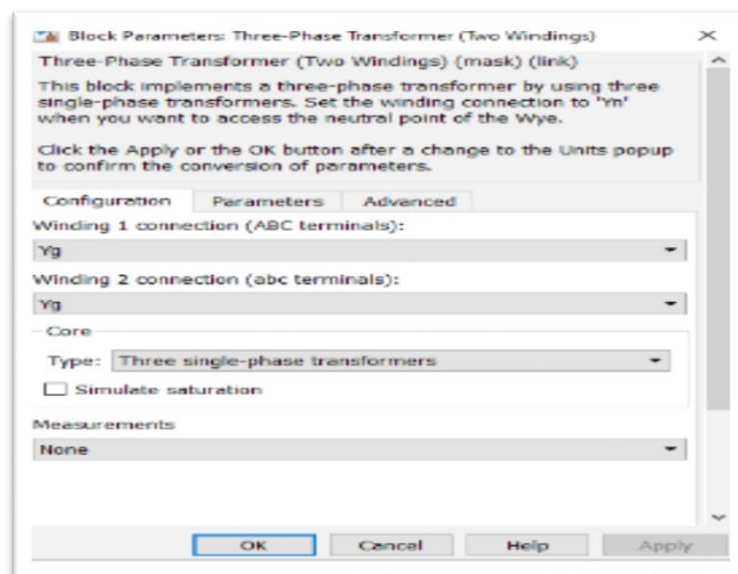


Figure 4(a)

4.5 TRANSFORMER STAR AND DELTA CONFIGURATIONS

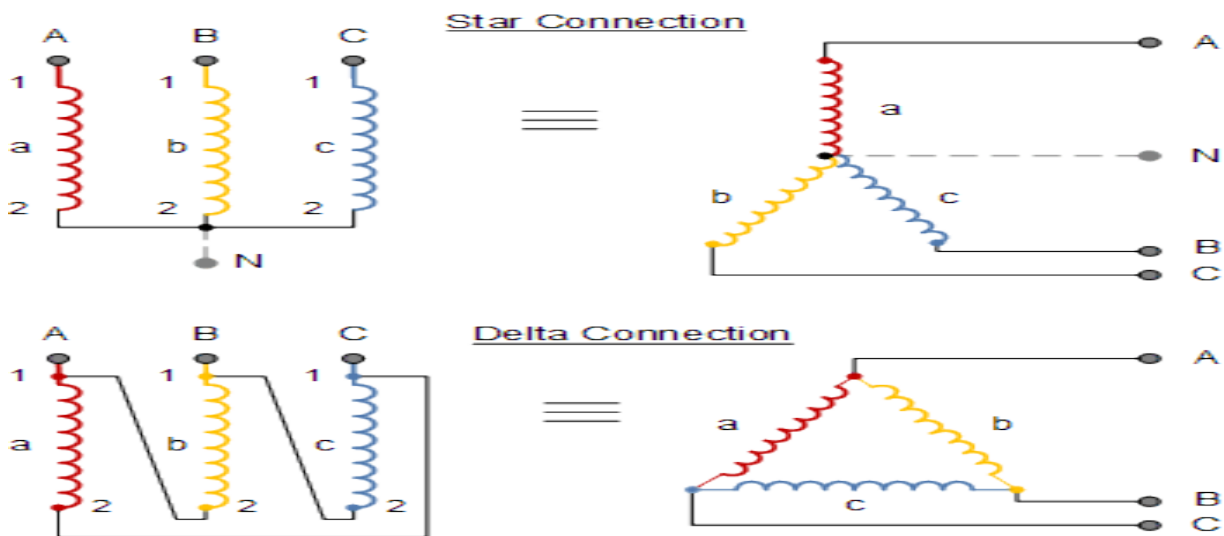


Fig 4.6 Transformer Star and Delta

Pictures are generally used on a three-phase transformer to exhibit the sort or sorts of affiliations used with promoted Y for star , D for delta, and Z for interconnected star basic windings, with lower case y, d, and z for their specific discretionary. By then, Star-Star would be named Yy, Delta would be stamped Dd and interconnected star to interconnected star would be Zz for a comparative kind of transformer.

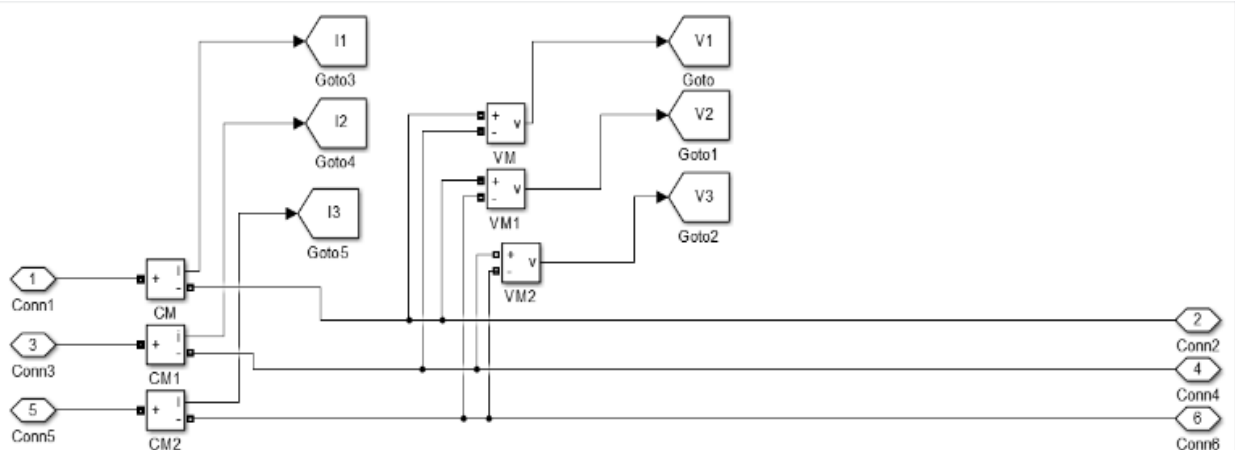


Figure 4.7

4.6 CONTROL UNIT ANN

ANNs began as a secondary architecture of human mind to perform the difficult type of algorithm with least error. Now they slowly adapt to the methods for problem solving, as each neuron is connected to each other's output: 1 neuron output is input of another neuron. These are connected in various patterns to perform various tasks. By using the process like back propagation we can change the input weight on each neuron to improve efficiency. Every neuron could be a hub which is associated with different hubs by means of connections that relate to natural axon-neurotransmitter dendrite associations. Each connection incorporates a weight, which decides the quality of 1 hub's impact on another.

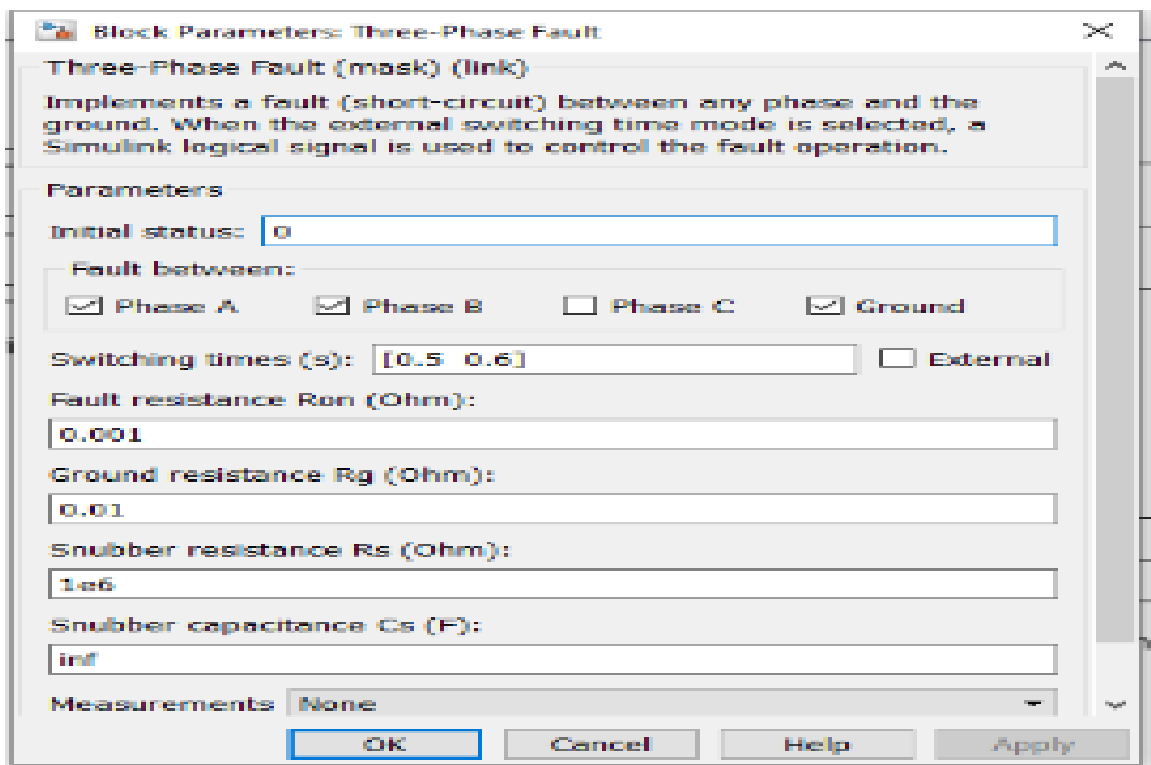


Figure 4.8

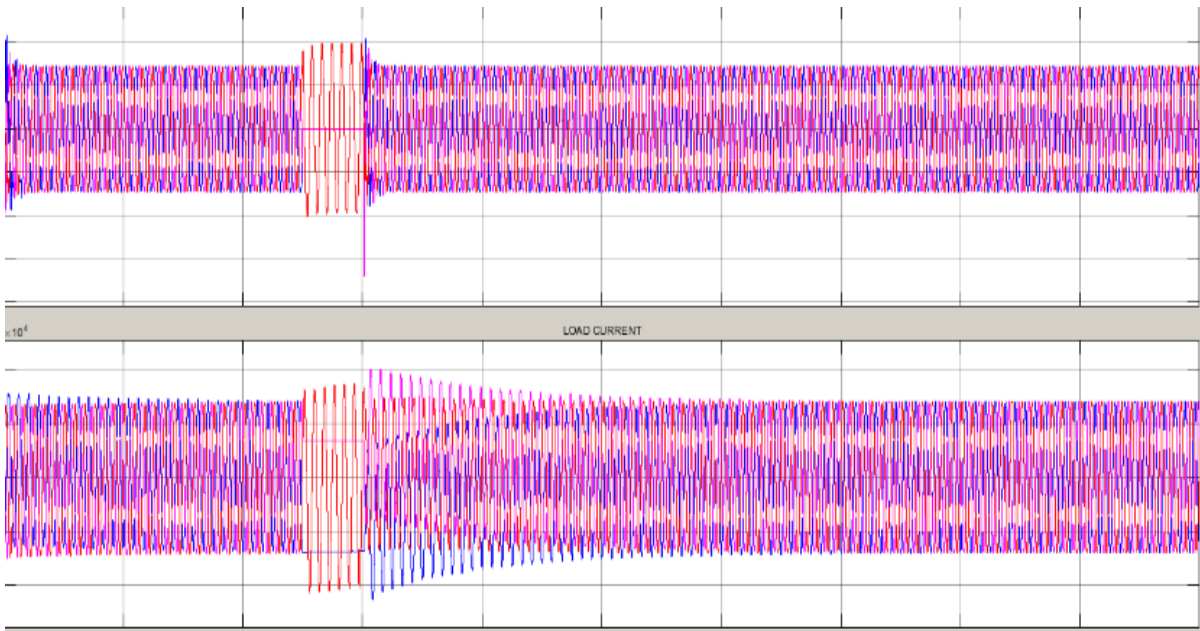


Figure 4.9

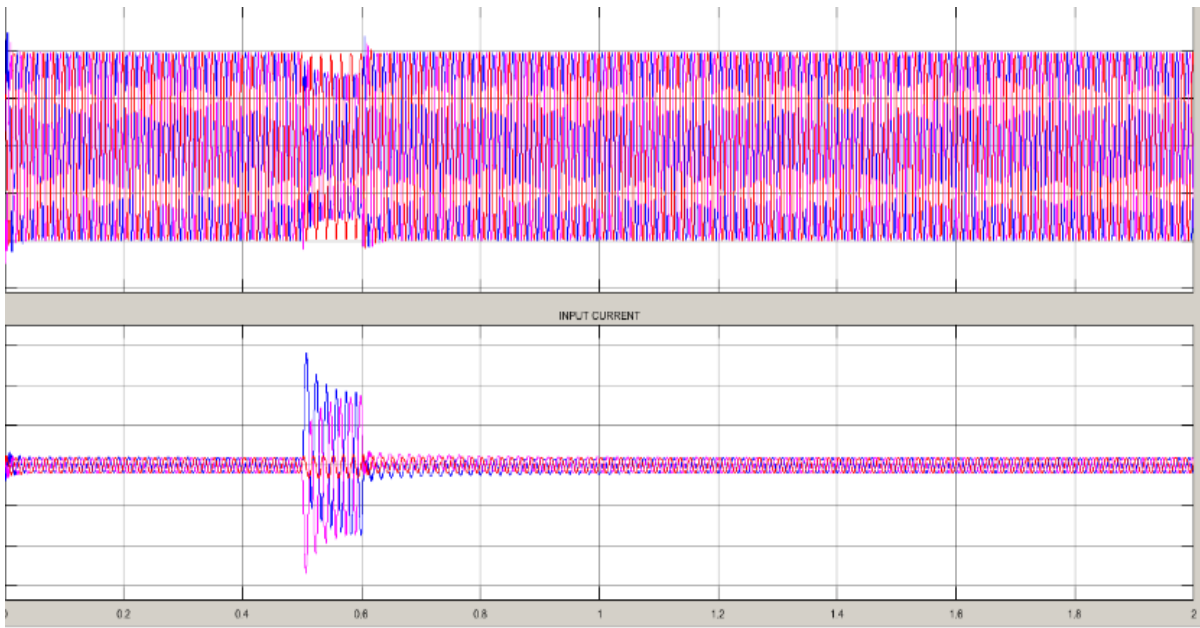


Figure 4.10

RESULT AND DISCUSSION

As shown in figure 4.8 and 4.9 as soon as fault is detected the information is send to ANN. this ANN find what type of fault it is and the distance of the fault from the generating end found by the process of time domain reflectometry. In this paper, we simulated different type of faults by use of 3 phase fault. As issue happens arrangement inductance and shunt capacitance are considered as conveyed parameter and arrangement opposition is viewed as gathered. For underground line approximating shunt capacitance considered to be neglected. At the point when deficiency happens flaw impedance goes down to zero and burden is evacuated by the circuit breakers at the hour of shortcoming, the issue impedance is viewed as zero and the heap should be expelled by ckt breakers. As the circuit at load end is opened so very large value of resistance is show approx. ohms. A zero impedance shortcoming is made some place on the line .after that a low voltage but negative in sign pulse which has pulse time less than the period showing a zero in decaying and falling time is sent from the source end at starting time =0. At that point the diagram between voltage or current at source end regarding time is plotted and the and the separation of the deficiency is given by ANN Technique where it is show shortcoming happen at 20.834km as appeared in Figure 4.11.

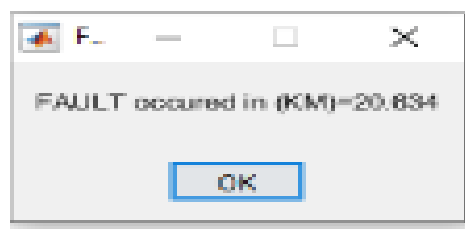


Figure 4.11

CONCLUSION

Saving of Overhead lines against a fault is important work for the security of facility. The work of a relay is to find and locate a fault and then cut it from the entire system. So, for this we need high speed protective relaying. The research work presented during this thesis provides two promising architectures for fault location on line using machine learning techniques. The primary architecture deploys four decision tree models one for every phase for fault identification in each phase. "Divide and conquer" strategy has been used to classify faults on each phase with greatest accuracy. Within the second architecture, Types of short faults. When tested ANN fault classification model, it outperformed decision trees with 100% accuracy on two and three terminal transmission lines. For fault location, the error of the fault distance was same because the travelling wave-based method utilized in first architecture. However, regression models don't require any manual calculations or measurements. Since both the architecture doesn't use current signals, the presented approach is immune against current-transformer saturation and its related errors. Additionally, the presented method uses simulated data for training which implies it may be deployed even when a replacement line is added to the transmission network which doesn't have any historical records of fault.

Conclusions Simulations for the line for 34.5kV, 100km underground power line was performed using MATLAB/SIMULINK. The extracted information about the signal was used to develop an ANN which was later used to identify the fault location. System in fault location was assessed and results were obtained. Finally in the given model method accurately detect and kill the fault. We also recommend further research to focus more on how the faults develop and the way they affect the system so a predictive fault location system may be improved to assist the facility utility and therefore the consumers manage the employment of their equipment and reduce losses to both parties. Transmission lines defend against uncovered flaw is that the most urgent assignment inside the assurance of office. The point of a defensive handing-off is to recognize the unusual signs

speaking to issues on an impact transmission. The research work presented during this thesis provides two promising architectures for fault location on line using machine learning techniques.

FUTURE WORK

In this thesis, problem of a having an adaptive, effective and resilient method for fault classification. There are several lines of research arising from this work which might be pursued as mentioned below: Since the test set considered within the thesis had just three samples in total (small size), the architectures have to be tested and evaluated with more test samples robustly in future. Additionally, architecture I had low accuracy of about 50% on the test set which can result to low sample size. Therefore, with more test set samples, this result has to be re-evaluated. However, the preliminary results are promising to steer to further investigation.

1. Four Terminal transmission lines aren't very removed from implementing. The proposed method is also possible to be extended N-terminal conductor within the future work which might give different insights.
2. The described method assumes single fault on the conductor. However, chances of multiple faults, double circuit faults etc. though are low cannot be ignored from protection perspective.
3. "Evolving Faults" as the faults begins to spread to 1 phase to another. Thus, evolving fault consists of two faults: primary fault and secondary fault consistent with their fault inception time.
4. The method proposed might be used for real-time monitoring of grid using spark-python. Once the fault has occurred, an alert might be founded from the strategy which might give the fault type and distance instantly.
5. Complex fault sequence elements might be incorporated in data which can increase the robustness of the machine learning technique and results might be compared.

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