



St. Mary's University

Faculty of Informatics

Department of Computer Science

**IMPROVING ROUTING PERFORMANCE OF ROUTERS AND
CORE SWITCHES BY USING ARTIFICIALLY INTELLIGENT
NODE**

By

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Advisor: Dr. Asrat Mulatu

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DECLARATION

I, the undersigned, declare that this thesis work is my original work, has not been presented for a degree in this or any other universities, and all sources of materials used for the thesis work have been duly acknowledged.

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Solomon Baye

Abstract

A routing protocol plays an important role in today's communication networks. It is also a protocol which is in charge of determining how routers and core-switches interconnect with each other and forward the packets through the best path to travel from a source to a destination using a predefined and user defined path finding and search algorithms. The leading and well-known routing protocols are Enhanced Interior Gateway Routing Protocol (EIGRP) and Open Shortest Path First (OSPF). In the metrics of Internet routing protocol performance, each of them has different architecture, flexibility, route processing delays and convergence abilities. The A* search algorithm is the more optimal and complete search algorithm than that of Dijkstra algorithm and perfect for finding the shortest path. This thesis presents a simulation-based combination of Enhanced Interior Gateway Routing Protocol (EIGRP) and A* search algorithm by using Network Simulator 2 (NS2). For performance evaluation of this combination, two network models are designed and configured with EIGRP and EIGRP with A* search algorithms. The evaluation of the proposed routing protocol is performed based on the quantitative metrics such as delay, throughput and packet loss through the simulated network models. The evaluation results show that EIGRP routing protocol with A* search algorithm provides better performance than EIGRP routing protocol.

Keywords: *EIGRP, OSPF, A* star, NS2, intelligent node.*

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List of Abbreviations

ABR	Area Border Router
ADSL	Asymmetric Digital Subscriber Line
AI	Artificial Intelligence
App	Application
BDR	Backup Designated Router
BGP	Border Gateway Protocol
CBR	Constant bit rate
CIDR	Classless Inter Domain Routing
CPU	Central Processing Unit
DES	Discrete Event Simulation
DR	Designated Router
DUAL	Diffusion Update Algorithm
EIGRP	Enhanced Interior Gateway Routing Protocol
IP	Internet Protocol
ISP	Internet Service Provider
LAN	Local area Network
LSA	Link-State Advertisement
LSAck	Link-State Acknowledgement
LSDB	Link-State Database
LSP	Link State Packet
LSR	Link-State Request
LSU	Link-State Update
MAC	Media Access Control
NAM	Network Animator
NET	Network Entity Title
NS2	Network Simulator 2
NSAP	Network Service Access Point
NSSA	Not-So-Stubby-Area
OPNET	Optimized Network Engineering Tool
OSI	Open Systems Interconnection
OSPF	Open Shortest Path First
OTCL	Object-Oriented Tool Command Language
PSNP	Partial Sequence Number Packet
RAM	Random Access Memory
RD	Reported Distance
ROM	Read Only Memory
VRAM	Volatile Radom Access Memory
WAN	Wide Area Network

CHAPTER ONE

INTRODUCTION

1.1 Background

Because of the wide advancement in technology and need for communication, there is a great demand for network communication. The mechanism and management of this communication takes-off with interaction among networks which is performed with the help of Routing. Routing protocol helps as a basis for communication among different users in huge computer networks [1] Presently, these protocols are on in wide-ranging use, Like OSPF, RIP, EIGRP, and BGP are practical using the routing table's information available with each node in the network. Routing protocols play a remarkable role for forwarding or to route the user data to its right destination. The job of routing protocols is very critical in terms of choosing the right route for user traffic and to forward it by having various networks limitations. There are number of routing protocols that have developed such as OSPF (Open Shortest Path First), RIP (Routing Information Protocol) and EIGRP (Enhanced Interior Gateway Routing Protocol) [2], [3] , [4]. All these mentioned protocols are based on their own routing process and thus does convergence with any topological change in the network. According to [2], [4] routing process can be defined as to select the best path among multiple paths from where the user data can be forwarded towards its destination. Most routing protocols are used to fix the shortest path from the sender to the receiver. Thus, each routing protocol has different routing process from the other. Therefore, the performance of each routing protocol differs when applying to the network having some real type of network limitations. Differences in network are the result of the change in traffic patterns, accessibility of new network resources and of removal, or failure of network resources.

For network optimization, routing protocols have got an important part of moving the user traffic across the network without compromising the network resources. For this purpose, routing process is performed by the routers in the network which uses any of the mentioned routing protocols. It should be noted here that OSPF, RIP and EIGRP use their own routing process which is different from the other [2]. This divergent approach makes each routing protocol special from the other and thus every protocol performs in a different manner with various network situations.

Open Shortest Path First (OSPF), Enhanced Interior Gateway Routing Protocol (EIGRP), Routing Information Protocol and Intermediate System to Intermediate System (IS-IS) are the leading interior routing protocols for such networks [5].

Enhanced Interior Gateway Routing Protocol (EIGRP) is an enhanced version of Interior Gateway Routing Protocol (IGRP) was introduced by Cisco in 1993 named as Enhanced Interior Gateway Routing Protocol (EIGRP) [6]. It is a distance vector routing protocol that uses an algorithm called as DUAL (Diffusion Update Algorithm). However, it is considered as hybrid routing protocol because it has also got the properties of link state protocols [2]. Hence, this routing protocol contains the features of both link state and distance vector routing protocols. EIGRP protocol is mostly used for large networks. Any router in the network which uses EIGRP protocol it keeps all routes in its routing table. This routing protocol also does convergence when there is any topological change occur in the network [3]. EIGRP protocol operation is based on four components such as Neighbor Discovery/ Recovery, Reliable Transport Protocol (RTP), DUAL and Protocol dependent module [7]. Neighbor discovery is one of the processes of EIGRP protocol in which a router discovers its neighbor routers by sending HELLO packets with regular interval of time. RTP ensures the reliable transmission of unicast or multicast packets of EIGRP protocol in the network [7]. DUAL plays a major role as a loop avoidance mechanism which is used for the topological change in the network.

Open Shortest Path First (OSPF) Routing Protocol For IP networks, Internet Engineering Task force introduced a link state routing protocol in mid-80`s named Open Shortest Path First (OSPF) routing protocol. OSPF widely uses in large enterprise networks because of its efficient convergence in the network [7]. Any dynamic routing protocol, routers distribute network topology information across the network. This exchange of topology information among the routers of the network is called as convergence activity. And the time spent for this activity is considered as convergence duration of the routing protocol [8], [9]. As OSPF is a dynamic routing protocol, so all routers that are configured with OSPF protocol will exchange the link state routing information to all the connected routers and thus build their own routing table. The routing table in each router is based on information it received from the other routers. Having routing table in each router, the Dijkstra algorithm is used to find the shortest route from the current router to all the connected routers [7]. When any link fails/ set (recovered) in the network, then all the routers in the network become active and therefore do convergence activity. During this convergence activity, each router exchanges this topological

change (link fails/ set) information across the network. And once each router is updated with the latest change in the network, it again updates its routing table [2], [3], [7].

RIP (Routing Information Protocol) is considered as one of the major distance vector routing protocol which offers hop count as a routing metric. It is an interior gateway routing protocol which works within an autonomous network system [8]. Typical RIP routing protocol offers a maximum of 15 hops count from sources towards the destination and therefore provide loop-free routing. Limitation of 15 hops count makes RIP routing protocol for the limited size network. Thus, offering more than 15 hops count destination as unreachable from source in RIP configured routing protocol [8], [10]. In RIP configured network, routers send and receive Request Message and Response Message from other RIP configured routers in the network with regular interval of time. This protocol uses set of timers as an important part for its convergence activity. These timers are named as update timer, invalid timer, flush timer and hold-down timer [8], [10]. Therefore, when the network is configured with RIP, this protocol is considered as a routing protocol that has slow convergence activity with limited hop counts but has less CPU utilization in the network. However, RIP can behave differently in terms of topological change from other two (OSPF and EIGRP) routing protocols as it converges in a different process.

EIGRP is a vendor specific that is industrialized by the company called Cisco. It is distance-vector protocol based on Diffusing Update Algorithm (DUAL). EIGRP is the only routing protocol that has got characteristics of both link state and distance vector routing Protocols. Nevertheless, the convergence time of EIGRP is faster than other protocols. It is also easy to configure. In other ways, OSPF is a link-state interior gateway protocol based on Dijkstra algorithm. OSPF routing protocol needs more time and knowledge to configure network and with high memory requirements.

The key and important functionality of routing protocols in IP networks is to carry data packets and sent them from sender to receiver. Transmitting data from a sender to a receiver by hopping one-node or multi-node is called routing. Routing protocols provide two facilities: firstly choosing paths for different pairs of sender/receiver nodes and, effectively transmitting data to the receiver.

Routing protocols are used to describe how routers and core switches communicate to each other, build routing tables information, make routing decisions and share information among neighbors. Routers and core switches are used to connect multiple different networks and to

provide packet forwarding for different types of networks. The main goal of routing protocols is to discover the optimum and best path from a sender to a receiver. These routing algorithms use different parameters based on a single or on several properties of the path in order to determine the optimal way to reach a given network.

Generally, routing protocol is the language a router speaks with other routers in order to share information about the reachability and status of network. It includes a procedure to select the best path based on the reachability information it has and for recording this information in a route table. Regarding to select the best path, a routing metric will be applied and it is computed by a routing algorithm. And routing protocol is taking an important and non-changeable role in today's communication networks. Protocols are also equipped with a procedure which is accountable for determining how routers communicate with each other and forward the packets through the best path to travel from a sender node to a receiver node.

1.2 Motivation

Every network especially IP-based networks need a more secure, robust and effective routing protocol for fast convergence, short end to end delay and the ability to recover from emergencies quickly [11]. The main motivation behind this is that to discover and open a begging solution for best performance of routing protocols by combining artificial intelligence search algorithms. Secondly, to analyze and show that artificial intelligence can be integrated with routing protocols so that an artificial intelligent node can be used to improve the routing performance of routers and core switches. Thirdly, find out the best routing protocols from the existing one and selecting search algorithms from AI.

Routing protocol performance can be measured by convergence times which are aimed and as a performance metrics for real-time applications are delay variation, end to end delay, jitter and throughput.

Simulation and validation are carried out by using NS2, GNS3, OPNET, JAVA and other simulation software's.

1.3 Statement of the Problem

There are many problems and obstacles that reduce and minimize the routing performance of routers and core-switches. So, these problems are the following.

1. Routers and core-switches use already configured routing protocol to determine the best and optimal path where that stored configuration might be corrupt, lost, damaged or malfunction and let the network fail.
2. Each router and core-switch participating in the network must know something about global state where this global state is
 - ✓ Inherently large
 - ✓ Dynamic
 - ✓ Hard to collect

This leads to problem in decision making (for both local and global) one.

3. A routing protocol must intelligently summarize relevant information about the network to minimize the routing table space. This helps the routing table to be
 - ✓ fast to look up
 - ✓ less to exchange

This improves the bandwidth optimization and performance of the routing protocols and, generally the network itself.

4. Routers and core-switches in the network must minimize number and frequency of control messages to achieve a better and effective performance in all metrics of quality of service. This scenario leads the network to be robust and this can help to avoid
 - ✓ black holes
 - ✓ loops
 - ✓ oscillations

Therefore, the above problems and concepts of routing motivated me to do research on routing protocols with the composition of artificial intelligence.

1.4 Objectives of the Research

1.4.1 General objective

The general objective of this research is to compare an effective routing algorithm by introducing artificial node in the network and using the concepts of A* search algorithm with respect to routing protocol.

1.4.2 Specific objectives

The specific objective of this research is listed below.

- ✓ To analyze and select best routing protocol from the existing protocols
- ✓ Finding out the best search algorithms in artificial intelligence in respect to routing protocols that can suit for it and selecting one.
- ✓ The selected search algorithm and routing protocol will be used to define an artificial node
- ✓ According to the selected routing protocol and search algorithms combined together in a compatible way to produce a best solution for the stated problems in the routing protocols.

1.5 Methodology

The following different kinds of methods and techniques are used in this thesis. By literature review, different kinds of papers on routing and A * search algorithm has been studied extensively and in- depth analysis is made on the following main concepts.

- ✓ What is routing protocols and which one is the best routing protocol among them.
- ✓ Routing protocol in detail analysis
- ✓ Search algorithms and their comparison among the different search algorithms in an artificial intelligence searches.
- ✓ A * search algorithm and its main idea and concept in respect to other search mechanisms.
- ✓ Ant colony optimization and their essence for routing
- ✓ Simulation based comparison of routing protocols.
- ✓ Different simulation and emulation software studied in detail.
- ✓ Applications of neural network in routing
- ✓ Designing a new protocol by combining EIGRP and A* search algorithm.
- ✓ Collect and analyses the result.
- ✓ Validate the result or comparatively analyses the result.

1.6 Research Questions

The following are the main research questions addressed in this research

- ✓ Which routing protocol or algorithm is best from the currently used ones?
- ✓ What search algorithm in artificial intelligence will suit for routing?
- ✓ How to develop best solution for routing performance by combining search algorithm and routing algorithm?

1.7 Scope and Limitation

This research work only focus studying about the routing protocols and identifying one from an existing one and then select best and suitable search algorithm for the selected routing protocol. Thus, the selected search algorithm with the combination of the routing protocol helps to improve the performance of routing protocols in routers and core-switches by introducing an artificial node.

In doing this thesis there are limitations and difficulties that challenges me. These limitations include finding out an outline for doing this thesis paper, software were not that much accessible and almost commercial one. Due to this reason it was difficult to find out the right software for the simulation and even though it was not possible to purchase it from outside due to the lack of credit card that can work outside our country. The other one is shortage of time, in accessible resources and hardware constraint.

1.8 Organization of the thesis

This thesis report is composed of six chapters. In the second chapter literature review in-depth study of routing protocols and techniques is described with suitable examples and graphs and about the Artificial Intelligence search namely A * star search algorithm in detail and shows that how it will suit for the selected routing protocol i.e. EIGRP. The third chapter is discusses about related work. The fourth chapter discusses about the selected routing protocol for this thesis which is namely Enhanced Interior Gateway Routing Protocol (EIGRP) in detail and with respect to the other routing protocols existed today. The fifth chapter is about the tools and techniques used to do this thesis paper and the simulation and emulation software used. Finally, the research findings and recommendations are presented in chapter six.

CHAPTER TWO

LITRATURE REVIEW

2.1 Technical Overview of Routing Protocols

2.1.1 General Overview

Routing protocol has a significant role in today's network and communication technologies improvement and growth by providing effective services. A routing protocol transports packets by transferring them between different nodes in different and many networks. When bearing in mind of a network, routing takes place (node or hop by node or hop). So, routing protocols have the following objectives: To communicate between routers and core-switches, to build routing tables information's among the neighboring node and the whole network, to make precise and simple routing decisions, to learn existing routes (learning from the existing information) and to share information amongst neighboring routers and core-switches.

The routers and core-switches are used mostly by connecting several networks and providing packet forwarding to different networks. The main point for routing protocols is to establish the best path from the source to the destination. A routing algorithm services several metrics, which are used to resolve the best method of reaching to a given network. These are established either on a single or on several properties of the path. Link State Routing Protocols and Distance Vector Routing Protocols are some classifications of routing protocols. This routing protocol is usually used for other types of communication networks such as Wireless Ad-Hoc Networks, Wireless Mesh Networks and so on.

Routers

A router is a computer networking device that forwards data packets towards their destinations through a process called routing. Router operates network layer of OSI model. The Internal components of routers are Central Processing Unit (CPU), Random Access Memory (RAM), Non Volatile Radom Access Memory (NVRAM), Flash and Read Only Memory (ROM).Routers have at least two network interfaces. These are LAN Interface and WAN interface. LAN Interfaces used to connect router to LAN network. It has a layer 2 MAC address and can be assigned a Layer 3 IP address and usually consist of an RJ-45 jack. WAN Interfaces are used to connect routers to external networks that interconnected LANs. Depending on the WAN technology, layer 2 address may be used. It uses a layer 3 IP address.

According to the features and applications, routers are divided into four major categories.

Broadband Routers: Broadband routers are used to connect computers/Laptops to connect to the Internet. Broadband routers are required when we connect internet through phones. ADSL modems are used for this purpose as they embed both phone and Ethernet jacks.

Wired and Wireless Routers: These days wired and wireless routers are most commonly used in the home and small office networking. Wired and wireless routers are able to transmit internet signals and maintain routing information in their routing table. They are also capable to filter traffic on IP addresses base.

Edge Router: Edge routers are placed at the edge of the ISP network. These are normally configured to external routing protocols like BGP (Border gateway protocol) and OSPF (Open Shortest Path First) to another BGP or OSFP of other ISP or large organization.

Core Router: Core router is used as the backbone of the LAN network. In some deployment scenarios, a core router may perform as a step-down backbone that interconnects the distribution routers from different branches of an organization. These routers possess high performance capabilities.

Core Switches

A core switch is a high capacity switch generally positioned within the backbone or physical core of networks. Core switch serves as the gateway to wide area network (WAN) or the Internet. As the name implies, a core switch is central to the network and needs to have significant capacity to handle the load sent to it. They provide the final aggregation point for the network and allow multiple aggregation modules to work together. In a public WAN, a core switch interconnection edges switch that are positioned on the edge of related network. In a local area network (LAN), this switch interconnects work group switch, which are relatively low capacity switch that are usually positioned in geographic clusters.

The difference between Core switch and other switch is:

- ❖ Core switch is required to always be fast, highly available and fault tolerant since it connects the entire aggregation switch. Therefore, a core switch should be a fully managed switch. But if it is a switch not used in the core layer, it can be smart switch or an unmanaged switch.

- ❖ Core switch is not always needed in a LAN while we may often have the aggregation switch and the access switch. Because in small networks that have only a couple so servers and a few client, there is no actual demand for a core switch vs aggregation switch.
- ❖ Only one core switch used in a small or midsize network, but the aggregation layers and the access layers might have multiple switches.

Switches are different from routers because routers operate at the Network layer (Layer 3) of the OSI model while switches operate at the Data Link layer (Layer 2). Routers use IP addresses to forward traffic, while switches use MAC addresses for this purpose. A MAC address is permanently configured on network adapters by their manufacturers and cannot be changed. Some Layer 3 switches operate at the Network layer of the OSI model.

Switches offer better security to networks because they use MAC addresses and can filter out traffic coming in from an unknown MAC address. Switches are better than hubs because they forward only incoming packets to the desired destination instead of broadcasting them to all devices.

Artificial Intelligent (AI) Overview

According [12] to the father of Artificial Intelligence, John McCarthy, it is *“The science and engineering of making intelligent machines, especially intelligent computer programs”*.

Artificial Intelligence is a way of making a computer, a computer-controlled robot, or a software think intelligently, in the similar manner the intelligent humans think.

AI is accomplished by studying how human brain works and how humans learn, decide, and work while trying to solve a problem, and then using the outcomes of this study as a basis of developing intelligent software and systems.

The Goals of AI describes in is [12]:

- **To Create Expert Systems:** The systems which exhibit intelligent behavior, learn, demonstrate, explain, and advice its users.
- **To Implement Human Intelligence in Machines:** Creating systems that understand, think, learn, and behave like humans.

Artificial intelligence contributes to science and technology based on disciplines such as Computer Science, Biology, Psychology, Linguistics, Mathematics, and Engineering. A major thrust of AI is in the development of computer functions associated with human intelligence, such as reasoning, learning, and problem solving. The programming without and with AI is different in the following ways. Table 2.1 shows the comparison of the two.

Table 2.1: Comparisons of Programming without and with AI

Programming Without AI	Programming Within AI
A computer program without AI can answer the specific questions it is meant to solve.	A computer program with AI can answer the generic questions it is meant to solve.
Modification is not quick and easy. It may lead to affecting the program adversely.	Quick and Easy program modification.
Modification in the program leads to change in its structure.	AI programs can absorb new modifications by putting highly independent pieces of information together.

Applications of AI

There are many important applications of AI. The following are most ultimate usages of AI [12].

- **Gaming:** AI plays crucial role in strategic games such as chess, poker, tic-tac-toe, etc., where machine can think of large number of possible positions based on heuristic knowledge.
- **Natural Language Processing:** It is possible to interact with the computer that understands natural language spoken by humans.
- **Expert Systems:** There are some applications which integrate machine, software, and special information to impart reasoning and advising. They provide explanation and advice to the users.
- **Vision Systems:** These systems understand, interpret, and comprehend visual input on the computer. For example,

- **Speech Recognition:** Some intelligent systems are capable of hearing and comprehending the language in terms of sentences and their meanings while a human talks to it. It can handle different accents, slang words, noise in the background, change in human's noise due to cold, etc.
- **Handwriting Recognition:** The handwriting recognition software reads the text written on paper by a pen or on screen by a stylus. It can recognize the shapes of the letters and convert it into editable text.
- **Intelligent Robots:** Robots are able to perform the tasks given by a human. They have sensors to detect physical data from the real world such as light, heat, temperature, movement, sound, bump, and pressure. They have efficient processors, multiple sensors and huge memory, to exhibit intelligence. In addition, they are capable of learning from their mistakes and they can adapt to the new environment.

2.1.2 Features of Routing Protocols

The features of routing protocols are:

✓ **Convergence:**

The time required for all routers in the network should be small so that the routing specific information can be easily known.

✓ **Loop Free:**

The routing protocol of router and core-switches should ensure a loop free route. The benefit of using, such routes are to efficiently obtain the available bandwidth.

✓ **Best Routes:**

The routing protocol selects the best path to the destination network.

✓ **Security:**

The protocol ensures a secured transmission of the data to a given destination.

2.1.3 Parameters of Routing

2.1.3.1 Parameters

The measurement path cost usually depends on metric parameters. Metrics are used in a routing protocol to decide which path to use to transmit a packet through an internetwork.

2.1.3.2 Purpose of a Metric

A value applied by the routing protocols, namely metric, is used to allocate a cost for reaching the destination. Metrics fix the optimal and best path in case of multiple paths present in the same destination by allocating the cost and evaluate the optimal path. Analyzing the metrics has many different ways for each routing protocols. For example, OSPF uses bandwidth while RIP (Routing Information Protocol) uses hop count and EIGRP uses a combination of bandwidth and delay.

2.1.3.3 Metric Parameters

The ranking of routes from most preferred to least preferred is measured by a metric. Different metrics are used by different routing protocols. In IP routing protocols, the following metrics are used mostly [13].

- ✓ **Hop count:** It counts the number of routers for which a packet traverses in order to reach the destination.
- ✓ **Bandwidth:** A bandwidth metric chooses its path based on bandwidth speed thus preferring high bandwidth link over low bandwidth.
- ✓ **Delay:** Delay is a measure of the time for a packet to pass through a path. Delay depends on some factors, such as link bandwidth, utilization, physical distance traveled and port queues.
- ✓ **Cost:** The cost can be represented either as a metric or a combination of metrics. The network administrator can estimate the cost to specify an ideal route.
- ✓ **Load:** It is described as the traffic utilization of a defined link. The routing protocol use load in the calculation of a best route.
- ✓ **Reliability:** It computes the link failure probability and it can be calculated from earlier failures or interface error count.

2.1.4 Types of Routing Protocols

The following list presents the mostly used classifications of routing protocols:

- ✓ Static and dynamic routing protocols.
- ✓ Distance Vector and Link State routing protocols.
- ✓ Class-full and Classless routing protocols.

2.1.5 Static versus Dynamic Routing

A routing process that a routing table follows a manual construction and fixed routes at boot time is called Static routing. This routing table information should be updated by the device and even by the network administrator when a new network is added and discarded in the network. For small network Static routing is suitable. Its performance degrades when the network topology is changed. The network administrator usually uses this information for controlling and maintaining the whole network.

The network has more control over the network in static routing. Its simple functionality and less CPU processing time are also advantages. The disadvantages of static routing are poor performance experienced when network topology changes, complexity of reconfiguring network topology changes and difficult manual setup procedure.

On the other hand, dynamic routing is a routing protocol in which the routing tables are formed automatically by using the routing protocol configuration such that the neighboring routers and core-switches exchange messages with each other. The optimal and best path procedure is piloted on the basis of bandwidth, link cost, hop number and delay. The protocol usually updates these values. Dynamic routing protocol has the advantage of shorter time spent by the administrator in maintaining and configuring routes. However it has variety of problems like routing loops and route inconsistency.

2.1.6 Class-full and Classless Routing Protocols

Based on the subnet mask, routing protocols are divided into Class-full and Classless routing as below:

Table 2.2: Classification of Routing Protocols

Distance Vector	Link State	Class
IGRP, RIP		Class-full
RIPv2, EIGRP	OSPF, IS-IS, NLSP	Classless

2.1.6.1 Class-full Routing

In Class-full routing, subnet masks achieve the same functionality all through the network topology and this kind of protocol does not send information of the subnet mask. A router makes the following functions and services to calculate a route [13], [14]. Routers use the same subnet mask which is directly connected to the interface of the major network. When the router is not directly connected to the interface of the same major network, it applies Class-full subnet mask to the route.

Class-full routing protocols are not used widely because:

- ✓ It cannot include routing updates.
- ✓ It cannot be used in sub-netted networks.
- ✓ It is not able to support Variable Length Subnet Masks (VLSM).
- ✓ It is unable to support dis-contiguous networks.

Fig. 2.1 is an example of a network where Class-full routing is used with the same subnet mask all through the network.

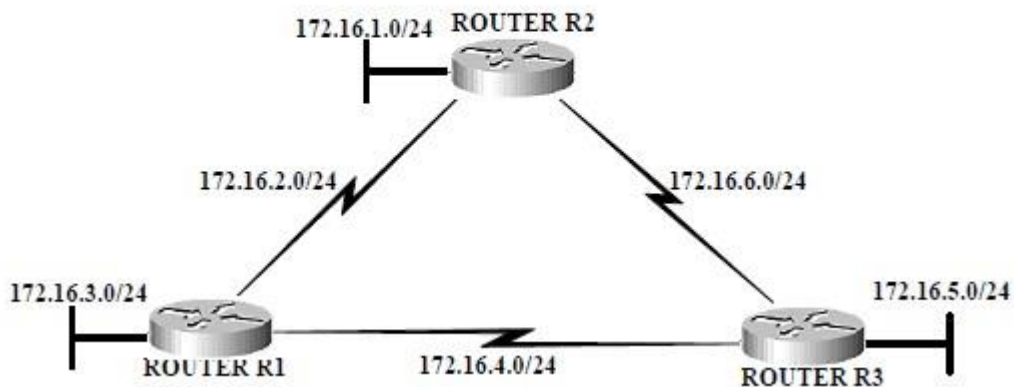


Fig. 2.1: Class-full routing with same subnet mask [13].

2.1.6.2 Classless Routing

In classless routing the subnet mask can be changed in the network topology and routing updates are included. Most networks do not depend on classes for being allocated these days

and also for determining the subnet mask, the value of the first octet is not used. Classless routing protocols support non end-to-end networks [13].

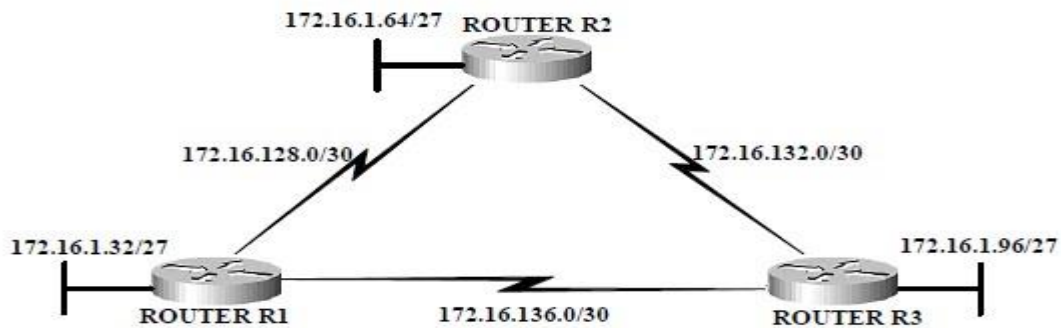


Fig. 2.2: Classless routing with different subnet mask [13].

2.1.7 Link State Routing

The Link State Routing (LSR) includes the Shortest Path First (SPF) where the functions and capabilities of routers and core-switches are to determine the shortest path among the network and store the information (The routing table information) in a database called link state database.

Switching the routing information among the nodes is done by the Link State Advertisements (LSA). By using flooding the information of the neighbors found in each LSA of a node and any change in link information of a neighbor's node is communicated through LSAs. When LSAs are received the nodes will observe the change. Then the routes are calculated again and resent to their neighbors. Finally, all nodes can maintain an identical database where they describe the topology of the networks. These link state or routing table information databases provide information of the link cost in the network and then a routing table is formed. This routing table carries information about the forwarded packets and also indicates the set of paths and their link cost. For calculating the path and cost for each link

Dijkstra algorithm is used. The link cost is set by the network operator which is the bandwidth and the network line, represented as the weight or length of that particular link.

After the link cost is assigned load balancing performance is achieved. Then the network congestion can be avoided. Thus, a network operator can change the routing by varying the link cost. Generally, the weights are left with the default values and it is suggested to inverse the link's capacity and then assigns the weight of a link on it. However, LSR protocols have

better flexibility. Link state protocols make better routing decision and minimize overall broadcast traffic and are able to make a better routing decision.

Two of the most common types of LSR protocols are OSPF and IS-IS. OSPF determines the shortest distance between nodes based on the weight of the link.

2.1.7.1 Features of LSR

The features of LSR are: Each router keeps the same database, large networks split into sub areas, include multiple paths to destination, faster non loop convergence and support an accurate metrics.

2.1.7.2 Techniques of Routing

Each router is responsible for accomplishing the following process [13].

- ✓ Each router learns about directly connected networks and its own links.
- ✓ Each router must have a connection with its directly connected adjacent networks and this is usually performed through HELLO packet exchanges.
- ✓ Each router must send link state packets which contains the state of the links.
- ✓ Each router stores a link state packet copy which is received by its neighbors.
- ✓ Each router independently establishes the least cost path for the topology.

2.1.7.3 Advantages and Disadvantages of LSR

Routers calculate routes independently and are independent of the calculation of intermediate routers in LSR protocols [15].

The major advantages of link state routing protocols are: They react very fast to change in connectivity and the packet size is very small. Disadvantages of link state routing are: Huge memory requirements, more complex to configure and ineffective under mobility for link changes.

2.1.8 Distance Vector Routing

In Distance vector routing protocol routes are function of distance and direction vectors where the distance is represented as hop count metrics and direction is represented as exit interface. The Bellman Ford algorithm is mainly used for the path calculation where the nodes take the

position of the vertices and the links in DVR. So in DVR, for each destination, a specific distance vector is maintained for all the nodes used in the network. The distance vector includes of destination ID, shortest distance and next hop. In this routing each node passes a distance vector to its neighbor and informs about the shortest paths. Every node depends on its neighboring nodes for collecting the route information.

Thus they discover routes coming from the adjacent nodes and advertise those routes information from their own side. Those nodes are responsible for exchanging the distance vector and the time needed for this purpose can vary from 10 to 90 seconds. When a node in a network path accepts the advertisement of the lowest cost from its neighbors, the receiving node then adds this entry to the routing table.

2.1.8.1 Services and Importance of Routing

The Bellman Ford algorithm is used in Distance vector routing protocol for identifying the best path. For calculating the best network path, different methods are used by the Distance Vector (DV) routing protocols. Nevertheless, for all DV routing protocols, the main characteristic of such algorithms is found to be the same. For finding the best path in a network, various route metrics are used to calculate the direction and the distance. For example, EIGRP uses the diffusion update algorithm (DUAL) for calculating the cost which is needed to reach a destination. Routing Information Protocol (RIP) uses hop count for choosing the best path and IGRP determines the best path by taking information of delay and bandwidth availability [16].

In Distance Vector routing protocol, the router keeps a list of known routes in a table and during the time of booting, the router initializes the routing table to identify the destination in a table and thus assigns the distance in that network. This measurement takes place in hops. In Distance Vector, routers and core-switches do not know the information of the entire path. In its place, the router knows the information about the direction and the interface from where the packets are sent [17].

2.1.8.2 Features of Distance Vector Routing

The features of DV routing protocol are given below [4].

- ✓ DV routing protocol describes its routing table where all neighbors are directly connected with the routing table information at a regular period.
- ✓ New information should put in each routing table instantly when the routes become unavailable.
- ✓ DV routing protocols are easy and efficient in smaller networks and thus require little management.
- ✓ DV routing is mainly based on hop counts vector.
- ✓ The DV algorithm is iterative.
- ✓ A fixed subnet mask length is used.

2.1.8.3 Advantages and Disadvantages of DV Routing

The advantages of DV routing protocols are: Easy and efficient in smaller networks, easy configuration and low resource usage.

DV routing protocol experiences the counting problem to infinity. In contrast, Bellman Ford algorithm cannot prevent routing loops and this is the main disadvantage of this [15].

Other disadvantages of DV routing protocols are: Loop creation, slow convergence, scalability problem and lack of metrics.

2.2 The A star (*) search algorithm in Artificial Intelligence

A* (pronounced 'A-star') is a search algorithm that finds the shortest path between some nodes in a graph.

Admissible heuristics as discussed in [18] and [19]: A* search is complete, A*search will always terminate and saving masses of memory with IDA* (Iterative Deepening A*)

Best-first greedy and A*: When you expand a node n , take each successor n' and place it on Pri-Queue with priority $h(n')$

$$(\text{Cost of getting to } n') + h(n')$$

$$\text{Let } g(n) = \text{Cost of getting to } n$$

and then define...

$$f(n) = g(n) + h(n) \text{ ----- (1)}$$

The A*Search Algorithm (“A-Star”) *f* Idea:

This search algorithm mainly focused on avoiding expanding paths that are already expensive
f Keep track of a) the cost to get to the node as well as b) the cost to the goal
f Evaluation function $f(n) = g(n) + h(n)$, *f* $g(n) =$ cost so far to reach *n* *f* $h(n) =$ estimated cost from *n* to goal
f $f(n) =$ estimated total cost of path through *n* to goal.

The A*Algorithm

Let $f(n)$ as the estimated cost of the low-cost solution that goes through node *n* and use the general search algorithm with a priority queue queuing strategy. If the heuristic is hopeful, that is to say, it never overestimates the distance to the goal, then A* is optimal and complete.

The routing algorithm Dijkstra path finding is used where: Dijkstra's algorithm is an algorithm for finding the shortest path between nodes in a graph, which may represent, for example, WAN, LAN and other networks. It was the foundation and discovery of the computer scientist Edsger W. Dijkstra in 1956 and published three years later [20].

This Dijkstra algorithm exists in many variants; Dijkstra's original variant found the shortest path between two nodes, but a more common variant fixes a single node as the "source" node and finds shortest path from the source to all other nodes in the graph, producing shortest-path tree.

For an agreed source node in the graph, the algorithm finds the shortest path between that node and every other node is also used for finding the shortest path from a single node to a single destination node by stopping the algorithm once the shortest path to the destination node has been determined. For example, if the nodes of the graph represent cities and edge path costs represent driving distances between pairs of cities connected by a direct road, Dijkstra's algorithm can be used to find the shortest route between one city and another. Finally, the shortest path algorithm is widely used in network routing protocols, most particularly IS-IS and Open Shortest Path First (OSPF).

According to [20] the novel Dijkstra algorithm does not use a min-priority queue and runs in time $O(|V|^2)$ (where $|V|$ is the number of nodes). The implementation based on a min-priority queue implemented by a Fibonacci heap and running in $O(|E| + |V| \log |V|)$ (where $|E|$ is the number of edges) is due

to Fredman and Tarjan 1984. This is asymptotically the fastest known single-source shortest-path algorithm for arbitrary directed graphs with unbounded non-negative weights. But, specialized cases (such as bounded/integer weights, directed acyclic graphs and so on) can indeed be improved further detailed in specialized variants.

Artificial intelligence in some fields, in particular, Dijkstra's algorithm or a variant of it is known as uniform-cost search and formulated as an instance of the more general idea of best-first search.

But, A* search algorithm is a generalized form of the Dijkstra search algorithm. Basically A* is faster, and will find the "best" solution given some reasonable conventions. Dijkstra (i.e. A* without heuristic) is better conditioned. So, A* search algorithm is much faster and better than this usually used search algorithm in routing due to the following stated reasons and conditions.

Dijkstra is algorithm essentially the same as A*, except there is no heuristic (H is always 0). Because, it has no heuristic, it searches by expanding out equally in every direction, but A* scan the area only in the direction of destination. Because of this Dijkstra algorithm usually ends up exploring a much larger area before the target is found. This usually makes it slower than A*. So, due to this reason the A* search algorithm is better and effective than Dijkstra's algorithm in saving time and completeness.

2.2.1 Heuristic Functions

A function that is used, when applied to a state, returns a number that is an estimate of the merit of the state, with respect to the goal is called Heuristic function [21].

Other ways, the heuristic tells us approximately how far the state is from the goal state*.

Best-first search f Idea: use an evaluation function $f(n)$ for each node, estimate of "desirability" and expand most desirable unexpanded node f .

Implementation: Order the nodes in open list (fringe) in decreasing order of desirability f

Special cases: greedy best-first search (A* search).

2.2.2 Admissible Heuristics

A function namely heuristic function is admissible if it never overestimates the distance to the goal. A heuristic $h(n)$ is admissible if for every node n , $h(n) \leq h^*(n)$, where $h^*(n)$ is the true cost to reach the goal state from n .

Suppose n is a goal state. Then it may assume that $h(n) = 0$, and hence the value is admissible. Now suppose $h(n')$ has an admissible value, for every node n that is within k or fewer steps (i.e. actions) from a goal state, for some $k \geq 0$. Let n be a node that is $k + 1$ steps from a goal state, and let n' be a successor of n along a path that is optimal from n to a goal state. Then by consistency it has, $h(n) \leq \text{cost}(n; n') + h(n') \leq \text{cost}(n; n') + \min \text{cost of reaching goal from } n' = \text{the minimum cost of reaching a goal state from } n$. Therefore, $h(n)$ is admissible.

Example: $h(v) = 0$ is an admissible heuristic. Less trivial example: If our nodes are points on the plane, then the straight-line distance, $h(v) = \sqrt{(vx - Tx)^2 + (vy - Ty)^2}$ is an admissible heuristic [22]. Or by checking the total cost it can neither prove that a heuristic is admissible nor that a heuristic is not admissible. The problem with this idea is that on the one hand you sum up the costs of the edges, but on the other hand you sum up the path cost (the heuristic values). For example, consider the following search tree with start node A and goal node C



and the following heuristic functions h_1 and h_2 :

$$\begin{array}{ll} h_1(A)=20; & h_2(A)=8 \\ h_1(B)=10; & h_2(B)=11 \\ h_1(C)=0; & h_2(C)=0 \end{array}$$

The sum of the total cost of the search graph is $10+10=20$. The sum of the heuristic values of h_1 is equal to $20+10+0=30$, which is larger than 20 although h_1 is admissible. The sum of the heuristic values of h_2 is equal to $8+11+0=19$, which is smaller than 20, but h_2 is not admissible, since $h_2(B)=11 \not\leq h^*(B)=10$.

A* with Admissible Heuristic Guarantees Optimal and best shortest Path.

Is A* Guaranteed to Terminate? There are finitely many acyclic paths in the search tree. A* only always considers acyclic paths. On each repetition of A* a new acyclic path is generated because: When a node is added the first time, a new path exists. When a node is

“promoted”, a new path to that node exists. It must be new because it’s shorter. So the very most work it could do is to look at every acyclic path in the graph. So, it terminates.

2.2.3 Consistent Heuristics

Assume two nodes a and b are connected by an edge. A heuristic function h is consistent or monotone if it satisfies the following: $h(a) \leq e(a, b) + h(b)$ where $e(a, b)$ is the edge distance from a to b .

Reasoning: If I want to reach T from a , then I can first go through b , then go to T from there. This is very similar to the triangle inequality [22], [23].

Example: $h(b) = 0$ is a consistent heuristic. Less trivial example, again: If our nodes are points on the plane, $h(b) = \sqrt{(bx - Tx)^2 + (by - Ty)^2}$ is a consistent heuristic. All consistent heuristics are admissible.

We are now ready to define the A*algorithm using a clear example and explanations in addition to the above point. Suppose we are given the following inputs: A graph $G = (B,E)$, with non-negative edge distances $e(a,b)$ A start node S and an end node T .

An admissible heuristic h Let $d(b)$ store the best path distance from S to b that we have seen so far. Then we can think of $d(b) + h(b)$ as the estimate of the distance from S to b , then from b to T . Let Q be a queue of nodes, sorted by $d(v) + h(v)$. A heuristic $h(n)$ is admissible if for every node n , $h(n) \leq h^*(n)$, where $h^*(n)$ is the true cost to reach the goal state from n . An admissible heuristic never overestimates the cost to reach the goal, i.e., it is optimistic. Example: $hSLD(n)$ (never overestimates the actual road distance). Theorem: if $h(n)$ is admissible, A* using TREESEARCH is optimal.

2.2.4 Performance of A*search algorithm

When we use an admissible heuristic [22], then A* returns the optimal path distance. Besides, any other algorithm using the same heuristic will expand at least as many nodes as A* search algorithm.

In practice, if we have a consistent heuristic, then A* can be much faster than Dijkstra’s algorithm. Example: Consider cities (points on the plane), with roads (edges) connecting them. Then the straight-line distance is a consistent heuristic.

Dominance

If $h_2(n) \geq h_1(n)$ for all n (both admissible) then, h_2 dominates h_1 .

For 8-puzzle heuristics h_1 and h_2 , typical search costs (average number of nodes expanded for solution depth d): Below is example of the average number of nodes expands. Average over 100 randomly generated 8-puzzle problems discussed in [22].

d	IDS	A*(h1)	A*(h2)
2	10	6	6
4	112	13	12
8	6384	39	25
12	364404	227	73
14	3473941	539	113
20	-----	7276	676
24	-----	39135	1641

Where, IDS= Intrusion Detection Systems, h_1 = number of tiles in the wrong position and h_2 = sum of Manhattan distances.

From the above we get that:

d=12 IDS = 3,644,035 nodes,

A*(h_1) = 227 nodes

A*(h_2) = 73 nodes.

d=24 IDS = too many nodes

A*(h_1) = 39,135 nodes

A*(h_2) = 1,641 nodes

Therefore, search h_2 is better and effective than h_1 because the number of node h_1 is much greater than h_2 . So h_2 is better for search. It is guaranteed to expand less or equal number of nodes and getting closer to the actual cost to goal. So a heuristic function h_2 (strictly) dominates h_1 if both are admissible and for every node n , $h_2(n)$ is (strictly) greater than $h_1(n)$.

Relaxed problems

- ✓ A relaxed problem is a problem with fewer restrictions on the actions.

- ✓ The cost of an optimal solution to a relaxed problem is an admissible heuristic for the original problem.
- ✓ If the rules of the 8-puzzle are relaxed so that a tile can move anywhere, then $h_1(n)$ gives the shortest solution
- ✓ If the rules are relaxed so that a tile can move to any adjacent square, then $h_2(n)$ gives the shortest solution

Properties of A*

- ✓ **Complete?** Yes (unless there are infinitely many nodes with $f \leq f(G)$, i.e. step-cost $> \epsilon$)
- ✓ **Time/Space?** It is the exponential of b^d Except if: $|h(n) - h^*(n)| \leq O(\log h^*(n))$
- ✓ **Optimal?** Yes
- ✓ **Optimally Efficient:** Yes (no algorithm with the same heuristic is guaranteed to expand fewer nodes)

Memory Bounded Heuristic Search: Recursive BFS (RBFS)

- ✓ How can we solve the memory problem for A* search algorithm?
- ✓ Idea: Try something like depth first search, but let's not forget everything about the branches we have partially explored.
- ✓ We remember the best f-value we have found so far in the branch we are deleting.

RBFS changes its mind very often in practice [24], [25].

This is because the $f=g+h$ become more accurate (less optimistic) as we approach the goal. Hence, higher level nodes have smaller f-values and will be explored first.

Problem: We should keep in memory whatever we can.

2.2.5 Pseudo code for A*

The goal node is denoted by `node_goal` and the source node is denoted by `node_start`

It maintains two lists: OPEN and CLOSE:

OPEN consists on nodes that have been visited but not expanded (meaning that successors have not been explored yet). This is the list of pending tasks:

CLOSE consists on nodes that have been visited and expanded (successors have been explored already and included in the open list, if this was the case).

Put `node_start` in the OPEN list with $f(\text{node_start})=h(\text{node_start})$ (initialization)

```

While the OPEN list is not empty {
Take from the open list the node node_current with the lowest
  f(node_current) = g(node_current) + h(node_current)
if node_current is node_goal we have found the solution; break
Generate each state node_successor that come after node_current
  for each node_successor of node_current{
Set successor_current_cost= g(node_current) + w(node_current, node_successor)
  if node_successor is in the OPEN list {
    if g(node_successor) < successor_current_cost continue
  } else if node_successor is in the CLOSED list {
    if g(node_successor) < successor_current_cost continue
Move node_successor from the CLOSED list to the OPEN list
  } else {
Add node_successor to the OPEN list
Set h(node_successor) =to the heuristic to node_goal
  }
Set g(node_successor)= successor_current_cost
  Set the part of node_successor to node_current
  }
Add node_current to the CLOSED list
}

if(node_current !=node_goal) exit with error ()the OPEN list empty

```

Comparisons to Dijkstra's Algorithm Observation: A* is very similar to Dijkstra's algorithm:

```

Put node_start in the OPEN list with f(node_start)=h(node_start) (initialization)
While the OPEN list is not empty {
Take from the open list the node node_current with the lowest
  f(node_current) = g(node_current) + h(node_current)
if node_current is node_goal we have found the solution; break
Generate each state node_successor that come after node_current
  for each node_successor of node_current{
Set successor_current_cost= g(node_current) + w(node_current, node_successor)

```

```

    if node_successor is in the OPEN list {
        if g(node_successor) < successor_current_cost continue
    } else if node_successor is in the CLOSED list {
        if g(node_successor) < successor_current_cost continue
    }
    Move node_successor from the CLOSED list to the OPEN list
} else {
    Add node_successor to the OPEN list
    Set h(node_successor) = to the heuristic to node_goal
}
Set g(node_successor) = successor_current_cost
    Set the part of node_successor to node_current
}
Add node_current to the CLOSED list
}

if (node_current != node_goal) exit with error () the OPEN list empty

```

In fact, Dijkstra's algorithm is a special case of A* search algorithm as described in detail in [26].

CHAPTER THREE

RELATED WORKS

In this section, it is tried to review different related works that are vital for my thesis work. By applying artificial intelligent node to improve the routing protocol performance in router and core switch is a very new yet an active area, intensive research was recently devoted to clarify remaining ambiguities, to identify limitations and difficulties, to propose solutions and to improve the performance of these networks. So some of the work done related to in artificial intelligence and routing protocol

3.1 Related to Artificial Intelligent

In [27] the authors presented the concepts of knowledge-Define Networking paradigm and how it operates with combines with Software- Defined Networking, Network Analytics. They show the basic steps of the main KDN control and described these steps in detail [27]. The author's presents the set of specific relevant uses-cases that illustrate the potential application of the KDN paradigm and the benefits a Knowledge Plane based on Machine learning may bring to common networking problems. For two representative use-cases, routing in an overlay network and resources management in Network Function Virtualization scenario, they provide experimental results that show the technical feasibility of proposed paradigm. The authors also discussed[27] the most relevant ones of the challenges such as New Machine Learning mechanisms, Non-Deterministic networks and Standardized datasets. Finally, the authors' conclude on the paper by analyzing the open research challenges associated with the KDN.

Another remarkable effort was presented in wireless networks throughput enhancement using AI [28] to quantify the impact of different protocols on AI. The main objective on this paper is to utilize the correct technique of artificial intelligence in multi-channel network. This multi-channel reduces interference and improves performance of the network. For achieving such a goal in wireless environment, the authors used efficient protocol and algorithm called candidate algorithm. The methodology that describe [28] on this work is three stages. The first step is to create a model for specific wireless environment, the second step is to choose the right tool to optimize the performance and the third step is the careful selection of

performance indicators for routing improvements. After choosing the methodology the authors conducted experiments in the Linux router real network as well as in the MATLAB. As a result, the algorithm is able to take routing decisions in a decentralized and asynchronous fashion. From the experiments, they got the result

According to [29], introduce why intelligence is demanded for evolving the emerging heterogeneous networks. It described in detail in the introduction fast development of current internet and Mobile Communication Industry, the system of mobile network operation, heterogeneous network, worldwide Interoperability for Microwave Access and enhanced Node base station [29]. On this paper [29], it also describes issues of heterogeneous network that can be benefit from AI based techniques like self-configuration, self-healing and self-optimization. They survey and discussed the AI-related self-organizing networks techniques in heterogeneous networks by classifying them base on the type of AI techniques. Techniques used on this paper machine learning, genetic algorithm, swarm intelligence and ant colony, fuzzy system, artificial neural networks and Markov models and Bayesian-based games [29]. New challenges and opportunities also described in detail in this paper.

Additionally, in [30] described solving routing problem in order to maintain continuous network transmission without any loss of packets. On this paper it is described about networking routing and router and other related work done in Artificial Intelligence which tackles routing problem such as shortest path algorithm, generic algorithm, distributed AI and agent based routing and algorithmic resource allocation methods. The author also presented the architecture and design of the proposed system and evaluated the performance of algorithm test. Finally, the authors concluded and suggested on the paper for future work.

Network routing problems also described [31] by survey on artificial intelligent. In this paper, it focus giving generic problem description and the situations of today's network, different types of routing protocol and techniques, artificial intelligent which tackles different types of routing problems in details.

In [32], discuss possible improvement in wireless sensor network routing and security through the employment of concepts coming from artificial intelligent area. The paper highlights routing in wireless sensor network, security in wireless sensor networks, related works, and defense mechanism for security in wireless sensor network using game theory.

In [33], attempts to encourage the use of artificial intelligence techniques in wireless sensor nodes. This paper is organized with introduction, designing the network topology, introducing neurons in sensor nodes, perform evaluation by simulation.

3.2 Related to Routing protocols

This part presents paper worked on related to routing protocol networking. In this [34] discussed the properties and review the main instance of network routing algorithms whose bottom-up design. Briefly introduces network routing and discussed the general characteristics of routing and the associated challenges for each of one of the considered network classes. The paper [34] also provides a comprehensive set of classification features that they would use to characterize routing protocols. The paper also described the ant and bee colony behaviors that have fueled the design of so many networks routing algorithm. They discuss in some detail [34] two main implementation, Bee Hive for wired connection networks and Bee Adhoc for MANETs.

In [35], proposed an open architecture to enable the pc-based router to support multiple tasks beyond solely routing and forwarding.

3.3 Research Gaps

Based on the finding of related works covered above, following are the areas identified that require significant research to be done:

Performance: This is an open challenge to optimize and improve the performance of routing protocol.

Routing: The routing protocols should be able to update routing tables dynamically according to topology changes. Routing protocols of previous common Adhoc networks were partly fail to provide a reliable communication. Therefore, there is a need of developing new routing algorithms and networking model for constructing a flexible and responsive integration model. One of the biggest challenges for researchers is to find out the best routing protocols from the existing one and selecting search algorithms from AI to suggest an efficient routing algorithm that can work by combining artificial intelligent with routing protocol.

Path Planning: Thus, new algorithms/methods in dynamic path planning are required to improve routing protocol.

Based on the above research gaps, trying find from search algorithm which is best and from routing protocol in the existing one.

CHAPTER FOUR

ENHANCED INTERIOR GATEWAY ROUTING PROTOCOL

4.1 Introduction

Enhanced Interior Gateway Routing Protocol (EIGRP) is a vendor specific protocol. It is CISCO's proprietary protocol that is an improved version of the interior gateway routing protocol (IGRP). EIGRP is being used as a more scalable protocol in both medium and large scale networks since 1992. EIGRP is said to be an extensively used IGRP where route computation is done through Diffusion Update Algorithm (DUAL). EIGRP can also be considered as hybrid protocol because of having link state protocol properties. Even if EIGRP is CISCO's proprietary protocol, there are some advantages than other routing protocol provides by EIGRP [2], [6] such as: easy to configure, loop free routes are offered, it keeps a backup path in the network to get the destination, and multiple network layer protocols are included, EIGRP convergence time is low and it is responsible for the reduction of the bandwidth utilization, it can work with Variable Length Subnet Mask (VLSM) and Class Less Inter Domain Routing (CIDR) and EIGRP also supports the routing update authentication. Because of the EIGRP is preferable from other routing protocols to improve the routing performance of routers and core switches by combining A* search algorithm. The disadvantage of this protocol is considered as Cisco proprietary routing protocol and routers from other vendors are not able to utilize EIGRP.

4.2 Protocol Structure

Table 4.1: Protocol structure of EIGRP

Bits 0 8 16 31

Version	Opcode	Checksum	
Flags			
Sequence Number			
Acknowledge Number			
Autonomous System Number			
Type		Length	

Table 4.1 demonstrates the protocol structure of EIGRP and each field is described below[13] and [36]:

- ✓ **Version:** Indicates the version of EIGRP
- ✓ **Opcode:** The Operation code usually specifies the message types. For example: 1. Update, 2. Reserved, 3. Query, 4. Reply, 5. HELLO, 6. IPX-SAP.
- ✓ **Checksum:** Identifies IP checksum that is calculated by using the same checksum algorithm.
- ✓ **Flag:** First bit (0x00000001) is used to form a new neighbor relationship and is known as initialization bit. Second bit (0x00000002) is used in proprietary multicast algorithm and is termed as conditional receive bit. There is no function for the remaining bits.
- ✓ **Sequence and Acknowledge Number:** Passing messages securely and reliably.
- ✓ **Autonomous System:** It explains the independent system numbers which is found in EIGRP domain. The separate routing tables are found to be associated with each AS because a gateway can be used in more than one AS. This field is used for specifying the exact routing table.
- ✓ **Type:** Determine the type field values which are:
 - 0x0001-EIGRP Parameters (Hello/Hold time)
 - 0x0002-Reserved
 - 0x0003-Sequence
 - 0x0004-Software Version of EIGRP
 - 0x0005-Next Multicast Sequence
 - 0x0012-IP Internal Routes
 - 0x0013-IP External Routes
- ✓ **Length:** Describes the length of the frame.

4.3 Technique of EIGRP

EIGRP has the following four procedures. These are:

- i. Neighbor Discovery/Recovery
- ii. Reliable Transport Protocol (RTP)
- iii. Diffusion Update Algorithm (DUAL)
- iv. Protocol Dependent Modules (PDM)

4.3.1 Neighbor Discovery/Recovery

The neighbor discovery/recovery technique lets the routers and core-switches to gain knowledge about other routers and core-switches which are directly linked to their networks using the routing information from the routing table [37], [38]. If the neighbors become unreachable and inaccessible, it is very important for them to be able to discover it. This is done by sending HELLO packets at intervals with a comparatively low overhead. After receiving a HELLO packet from its neighbors, the router and core-switches ensures that its neighboring routers and core-switches are aware of the state and the exchange of routing information is possible. In case of high speed networks, the default value for HELLO time is 5 seconds. Every HELLO packet advertises the holding time for maintaining the relationship.

The particular time when the neighbor judges the sender as alive is called Hold time. 15 seconds is the default value of hold time. If the EIGRP router and core-switches does not accept any HELLO packets from the adjacent router and core-switches during the hold time interval, the adjacent router or core-switch is removed from the routing table. Thus, hold time is not only to be used for detecting the loss of neighbors but also for discovering neighbors.

On multipoint interfaces, HELLO/Hold time for networks with link speed T-1 is usually set to 60/180 seconds [39]. The convergence time lengthened with the extension of the HELLO interval time. Nevertheless, HELLO intervals with long duration are possible to be implemented in congested networks of several EIGRP routers. In a network, the HELLO/Hold time differs among the routers. A rule of thumb states that the hold time should be equal to thrice of the HELLO time [40]. Table 4.2 presents the default values of HELLO and hold times for EIGRP [40].

Table 4.2: EIGRP interval time for Hello and Hold

Bandwidth	Example Link	Hello Interval Default Value	Hold Interval Default value
1.544 Mbps or Slower	Multipoint Frame Relay	60 seconds	180 seconds
1.544 Mbps	T1, Ethernet	5 seconds	15 seconds

4.3.2 Reliable Transport Protocol

The routing updates information is used to make the sorting in series using the sequence number. RTP allows intermixed transmission of multicast or unicast packets [8], [10]. The certain EIGRP packets need to be transmitted reliably while others do not require [41]. Hence reliability can be ensured according to the requirement. For instance, in case of Ethernet, which is a multi-access network and provide multicasting capacity, it is not vital to transmit HELLOs reliably to other neighbors.

Therefore, by sending a single multicast HELLO, EIGRP informs receivers, that the packets are not needed to be acknowledged. But updating packets need to be acknowledged when they are sent. RTP has a condition to transmit the multicast packet very fast when there are some unacknowledged packets left.

For this reason, in the presence of varying speed links, this helps to ensure that the convergence time are low.

4.3.3 Diffusion Update Algorithm

The Diffusion Update Algorithm (DUAL) uses some requirements and concepts which has a significant role in loop-avoidance mechanism as follows:

✓ **Feasible Distance (FD)**

The lowest cost needed to reach the destination is usually termed as the feasible distance for that specific destination.

✓ **Reported Distance (RD)**

A Router has a cost for reaching the destination and it is denoted as reported distance.

✓ **Successor**

A Successor is basically an adjacent router which determines the least-cost route to the destination network.

✓ **Feasible Successor (FS)**

FS is an adjacent router which is used to offer a loop free backup path to the destination by fulfilling the conditions of FC.

✓ **Feasible Condition (FC)**

After the condition of FD is met, FC is used in order to select the reasonable successor. The RD advertised by a router should be less than the FD to the same destination for fulfilling the condition.

Mainly the DUAL is responsible for doing all route calculations in EIGRP. The main task of DUAL includes keeping a table, known as topology table, which includes all the entries found from the loop-free paths advertised by all routers and core-switches. DUAL selects the best loop-free path (known as successor path) and second best loop free path (known as feasible path) from the topology table by using the distance information and then save this into the routing table. Successor is the neighbor of the least cost route to the destination.

By using the topology table, DUAL can check if another best loop-free path is available. DUAL does this when the successor path is inaccessible. This path is recognized as feasible path. The reasonable path is selected if it satisfies the FC. The FC condition is possible to be satisfied if the neighbor's RD to a network is less than the RD of the local router. When a neighbor router meets the FC condition, it is then termed as FS.

In case of having no loop-free path in the topology table, re-calculation of the route must take place and then the DUAL inquire its neighbors. This occurs during re-calculation for searching a new successor. Although, the re-calculation of the route does not seem to be processor-intensive, it may have an effect on the convergence time and consequently, it is useful for avoiding needless computations. In case of having any FS, DUAL is used for avoiding any needless re-computation. If we consider Fig 4.1, we will be able to understand how the DUAL converges. This example aims at router K for the destination only. The cost of K (hops) coming from each router is presented below [38]:

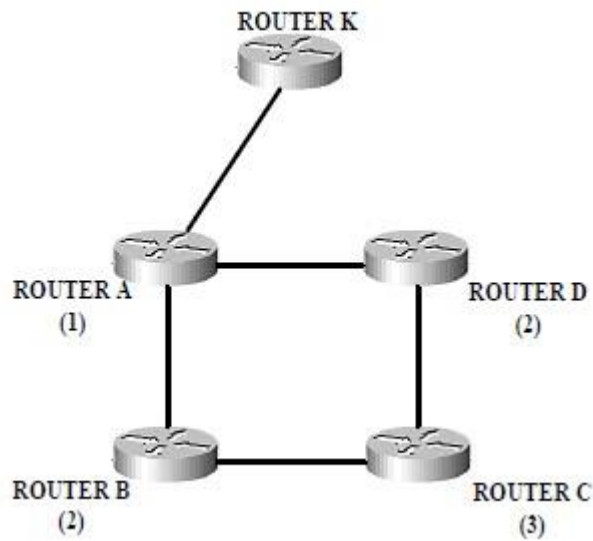


Fig. 4.1: DUAL placed in the network [38].

In Fig. 4.2, the link from A to D fails. When the loss of the FS occurs, a message goes to the adjacent router sent by D. This is received by C. Then C determines if there is any FS. In case of having no FS, C needs to begin a new route calculation by entering the active state. The cost from router C to router K is 3 and the cost from router B to router K is 2. Hence it is possible for C to switch to B. There is no effect on router A and B for this change. Thus they have no contribution in finding the reasonable successor.

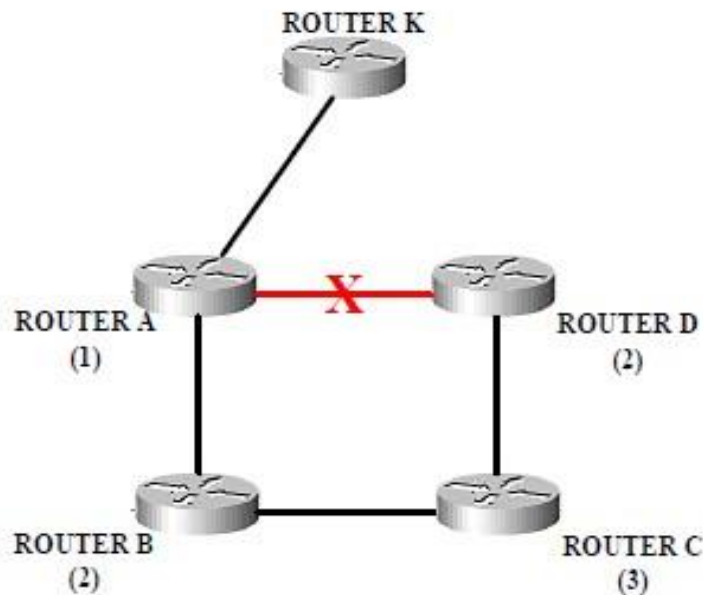


Fig. 4.2: Failure Link of Network Topology [38].

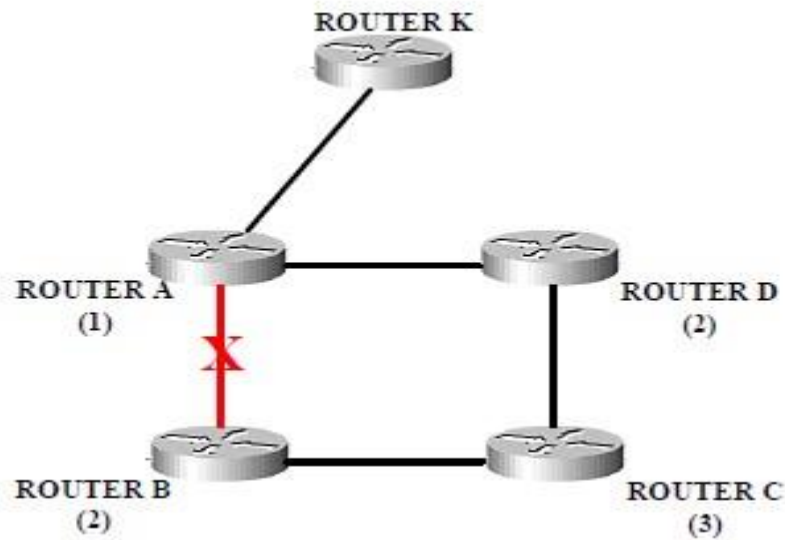


Fig. 4.3: Failure Link of Network Topology [38].

Now, observe the case in fig. 4.3, where the link from A to B fails. B is found in this scenario to have been lost its successor and thus no FS exists. Router C cannot be treated as FS to B, as the cost of C is more than the present cost of B. Consequently, the route computation is to be performed by B and for this, B sends a query to its neighbor C. In reply, C acknowledges the query because C does not need to perform the route calculation.

When B receives the reply, it assumes that all the adjacent routers have processed the link failure. B can choose C for getting the destinations as its successor with a cost of 4. It didn't have any effect on A and D for changing the topology and thus, C needed just to reply on B.

4.4 EIGRP Metrics

By using total delay and the minimum link bandwidth, it is possible to define the routing metrics in EIGRP. The metrics, which consists of bandwidth, reliability, delay, and load are considered to be used for the purpose of calculating the preferred path to the networks. The EIGRP routing update takes the hop count into account though EIGRP does not include hop count as a component of composite metrics. The total delay and the minimum bandwidth metrics can be achieved from values [39] which are put together on interfaces and the formula used to compute the metric is followed by:

$$256 * \left[\left(k_1 * Bw + \frac{K_2 * Bw}{256 - Load} + K_3 * Delay \right) \right] * \frac{K_5}{K_4 + Reliability} \quad (1)$$

For weights, the default values are:

$$K_1=1, \quad K_2=0, \quad K_3=1, \quad K_4=0, \quad K_5=0,$$

Put those values in equation 1.

$$256 * (Bw + Delay) \quad (2)$$

If $K_5=0$, the formula trims down like

$$256 * \left[(K_1 * Bw + \frac{K_2 * Bw}{256 - Load} + K_3 * Delay) \right]$$

EIGRP uses to calculate scale bandwidth is:

$$Bw = \left(\frac{10^7}{B(n)} \right) * 256 \quad (3)$$

Where, $B(n)$ is in kilobits and represents the minimum bandwidth on the interface to destination.

Bw= Bandwidth

The formula that EIGRP uses to calculate scale delay is:

$$Delay = D(n) * 256 \quad (4)$$

Where D (n) represents in microseconds and sum of the delays configured on the interface to the destination.

4.5 EIGRP Convergence

In fig. 4.4, that the link from R3 and R5 goes down and at the same time R3 identifies the failure of the link. There is no FS present in the topology database and hence the role of R3 is to be entered into the active convergence. R4 and R2, on the other hand, are the only neighbors to R3. Given that, there is no availability of route with lower FD, R3 sends a message to both R4 and R2 for gaining a logical successor. R2, for acknowledgement, replies to R3 and indicates that there is no availability of successor.

On the other hand, R3 gets positive acknowledgement from R4 and the FS with higher FD becomes available to R3. The distance and new path is allowed by R3 and then added to the

routing table. Followed by R2 and R4 are sent an update about the higher metric. In the network, all the routes converge when the updates are reached to them.

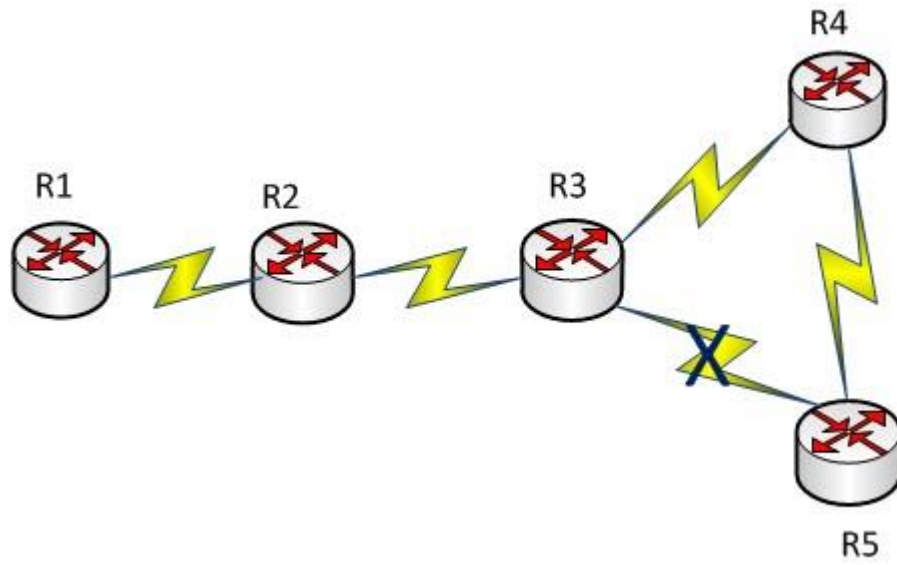


Fig. 4.4: Network topology of EIGRP

CHAPTER FIVE

RESULTS AND DISCUSSIONS

5.1 Introduction

Several software packages exist for running computer-based simulation modeling (e.g. multi-method modeling, NS-2 simulator, OPNET and other) that makes all the modeling almost effortless.

In this thesis, Network Simulator 2 (NS-2) is used. NS-2 is Discrete-event driven network simulation, Object Oriented which is an extended Tcl (OTcl) interpreter that can be written in C++ and OTcl where C++ implements the code that executed frequently and OTcl configures the system. This simulator (NS-2) can be run on UNIX or Linux and Windows platforms under some configurations and settings.

NS-2 can be used for parallel and distributed simulation: PDNS. NS-2 provides emulation functionalities. NS-2 comes closer to reality than other simulators [42]. A good simulation design, good results can be achieved with NS-2 [42]. Even if, the OPNET is not used in this simulation it is also a simulator built on top of discrete event system (DES) and it simulates the system behavior by modeling each event in the system and processes it through user defined processes. OPNET is very powerful software to simulate heterogeneous network with various protocols.

5.2 Structure of NS-2

This network simulator is characterized by these parameters [43], [44].

- ✓ Free
- ✓ Almost all network components are implemented
- ✓ Active contributions from researchers
- ✓ Easy to modify and/or add new functions

NS-2 network simulator is composed of the following main components. These are

1. Application

Those applications in NS-2 are communication instigator where they poke the agent to which they're attached

- ✓ Introduction of Process class

- ✓ Models any entity that is capable of receiving, requesting or processing data

Two basic types:

- ✓ class Process : public TclObject[ns-2.29/common/ns-process.h]
- 1. class Application: public Process [ns-2.29/apps/app.h]
- 2. class Traffic Generator: public Application [ns-2.29/tools/trafgen.h]

This application assumes attached to a TCP Agent

- ✓ start(), stop(), send(), recv()
E.g. class TelnetApp
[ns-2.20/apps/telnet.h]
 - ✓ Schedule agent_->sendmsg()calls based on exponential inter-arrival timer
- ✓ Traffic Generator
 - ✓ Assumes attached to a UDP Agent
init(), next_interval()
E.g. class POO_Traffic
[ns-2.29/tools/pareto.cc]
 - ✓ Schedule bursts of packets (Pareto on-off source)
- 2. Agent
 - ❖ Packet generator/consumer

TCP/UDP stacks

- ❖ timeout(),send(), etc
 - ✓ Allocate and schedule packets
- ❖ recv(), etc
 - ✓ Callback to app_to notify of data

Subtype of Connector

- ❖ class Agent: public Connector
[ns-2.29/common/agent.h, .../tcl/lib/ns-agent.tcl]
- ❖ class Tcp Agent: public Agent
 - ✓ class Full Tcp Agent: public Tcp Agent
- ❖ class Udp Agent: public Agent
- 3. Node
 - ❖ Addressable entity built from classifiers
 - ✓ Distributes incoming data to agents

- ✓ Distributes outgoing data to links
- ❖ Simplest unicast case has address and port classifiers, others may have more
- ❖ Node, LanNode, etc derived from ParentNode

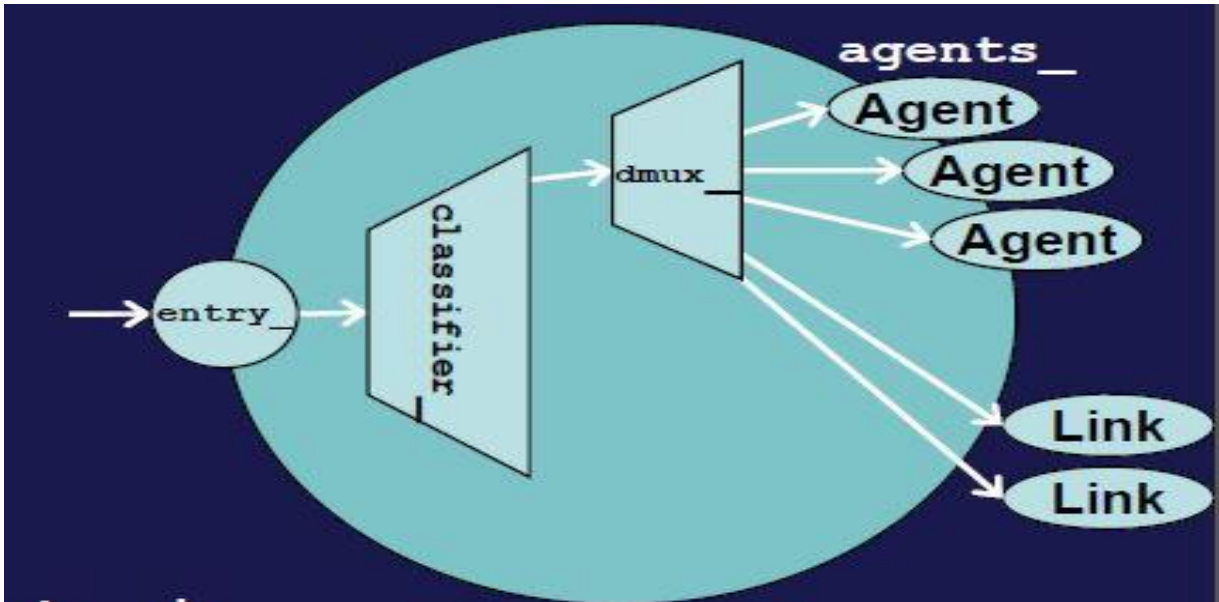


Fig. 5.1: Nodes and agents integration

4. Link

Are set of queues in the NS-2 simulation program or code.

- ✓ An OTcl amalgam of C++ objects[ns-2.29/tcl/lib/ns-link.tcl]
 - ✦ class Simple Link–superclass Link
 - ✦ Simulator instproc duplex-link{ n1 n2 bw delay type args }
- ✓ More complex links may have complex link delay/bw characteristics...[ns-2.29/link/delay.h]
 - ✦ class Link Delay: public Connector
- ✓ Multiple queue_ elements [ns-2.29/queue/{queue.h,red.h,...}]
 - ✦ class Queue: public Connector
 - ✦ class RedQueue : public Queue

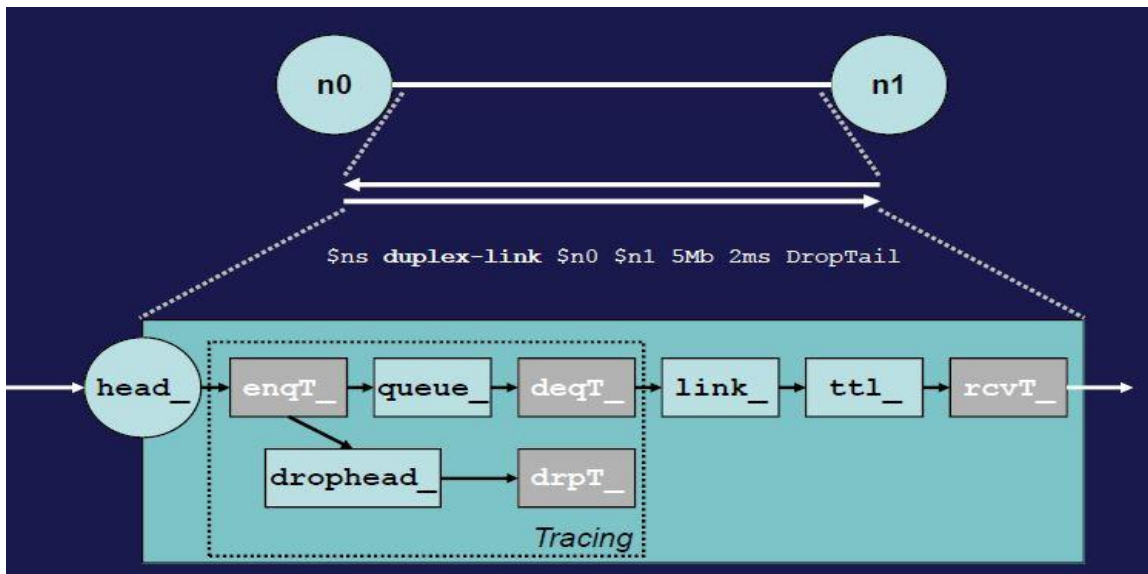


Fig. 5.2: Link example and some functions in it

Basically, NS-2 is composed of

1. NS2: the simulator itself
2. NAM: Network animator. Visualized trace tool (not really).
 Nam editor: GUI interface to generate ns scripts
3. Pre-processing:
 Traffic and topology generators
4. Post-processing:
 Simple trace analysis, often in Awk, Perl (mostly), or Tcl

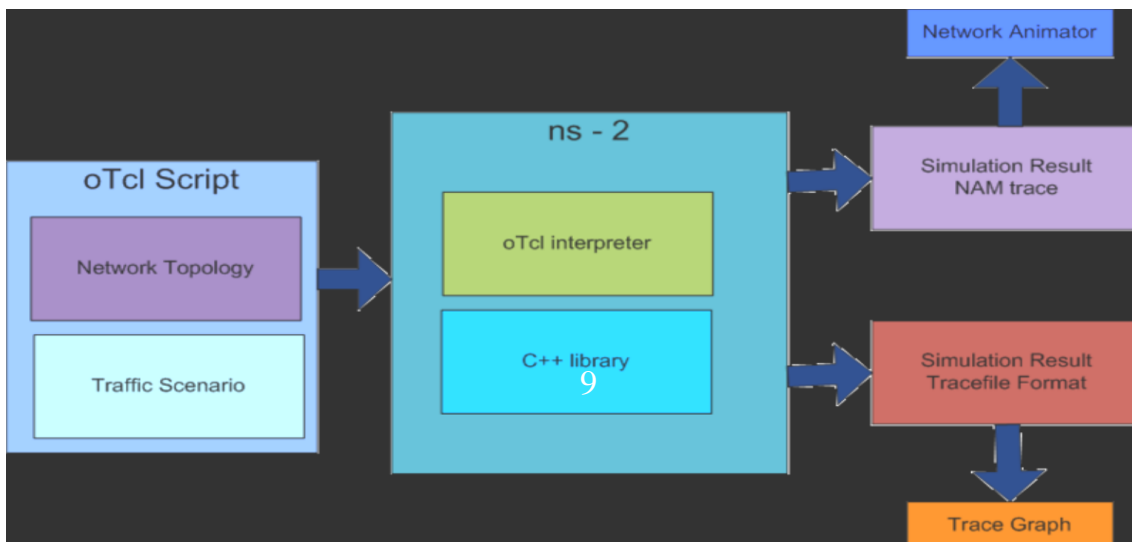


Fig. 5.3: Architecture of NS-2

5.3 Design and Analysis in NS-2

NS-2 uses the programs or codes written in C++ or TCL to simulate the designed network.

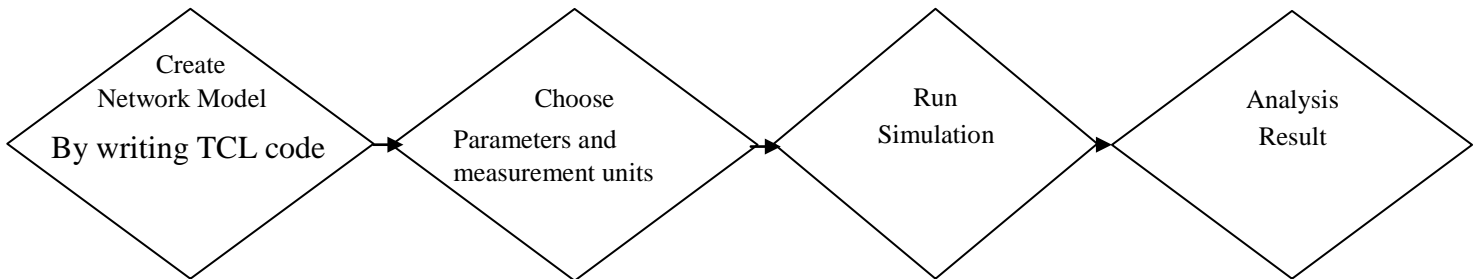


Fig. 5.4: Designing Steps

5.4 Simulation Study

The protocols used here is EIGRP routing protocol and A * search algorithm. The routing protocol and the search algorithm together are evaluated based on the quantitative metrics such as convergence duration, packet delay variation, end to end delay, jitter and throughput.

5.5 Network Topology

According to [45] Network topology is the arrangement of various elements of a computer network. It is typically described as either physical or logical. Different placements of network components such as device location and the shape of cabling layout are part of physical topology. A physical network topology refers to the actual layout of nodes and other networking devices. On the other hand, Logical topology illustrates how the data passes through the network regardless of the physical design or refers to the communication methods used by different components. In many cases, network topologies may be identical, but the distances between nodes, physical interconnections, transmission rates and signal types will still be different. For this simulation purpose, mesh topology, all node in the network are connected to every other node, is used. Because mesh topology have the following advantages that describes in [45]:

- ❖ A mesh network is highly reliable because of redundant multiple paths between nodes.
- ❖ A failure of a single node not affect network operations.
- ❖ Nodes can be added or removed without affecting the network.

For this simulation study mesh network topology was selected, and then designed wired network topology consisting of 12 nodes. Choosing of these 12 number of node is to show easily and better understanding path from source to destination on the physical network topology, to minimize the execution time of simulation [42] (when the number of node increase, simulation execution time is increased, the time taken to exchange data between node is not only determined by the size of the simulation and number of nodes used, but also by the speed at which the network hardware can exchange data) and to exchange packets between the nodes as they come within hearing range of one another.

A wired network topology consisting of 12 nodes has been designed as shown in Fig. 5.5 below.

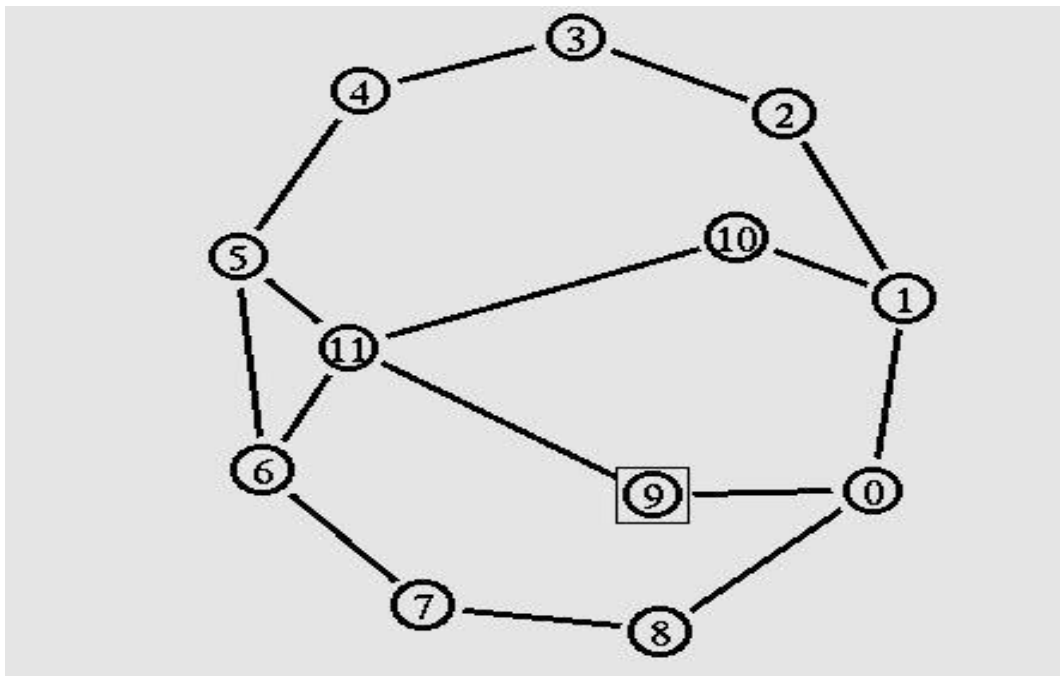


Fig. 5.5: Wired network topology with 12 nodes

When the communication between those nodes starts the path that a packet follows is determined by the algorithm used to design this topology. To demonstrate this Fig 5.6 is more suitable.

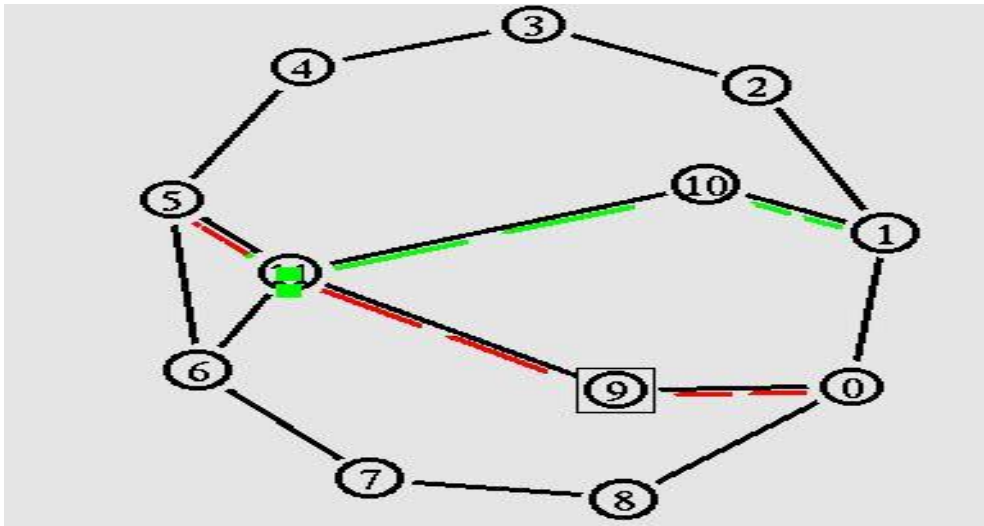


Fig. 5.6: Wired network topology with source and destination scenario

In this topology there are two different communications as indicated by the green (upper) and red (lower) colors. Thus, the red color which starts from node 0 as a source and transmitted it to the destination as node 5 with minimum path of four. The other one is the green color that starts from node 1 as a source and destination to node 5.

Both of those communications are UDP with CBR application traffic. As shown in the topology there is no failure and the next Fig.5.7 shows what happened when one communication link fails and how the algorithm reroutes to find out the next shortest path to overcome the failure.

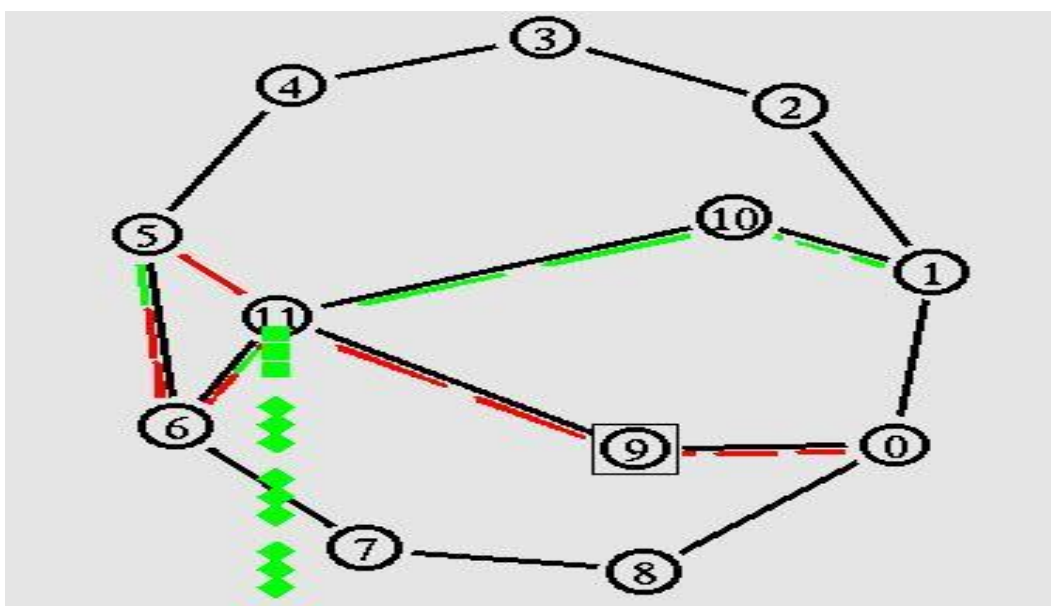


Fig. 5.7: Wired network topology communication line failure

In Fig 5.7, the line between the nodes 11 and 5 failed. Due to this failure the route between the nodes 0 to 5 and 1 to 5 automatically changed by the algorithm used to create another best and shortest path. Even if, there are additional paths but the algorithm selects the shortest path for the two communications.

In such cases EIGRP with A* search algorithm used to find out the paths and redirect the communication to the best and shortest path. In this topology EIGRP with A * search algorithm used and as showed above in the figure when the link failure happens the packets forwarded to their destination from where they were before the failure happens. So, no need of sending them again from their source.

5.6 Measurements

In this section, the main measurement units of the performance metrics, such as Packet-loss, delay and throughput are done from the acquired results of Discrete Event Simulation which is network simulation 2 (NS2).

5.7 Simulation Results and Analysis

In this section, the simulation results with a brief description and explanation is presented. There are two network models, which are configured and run using network simulator 2 (NS2). The first one is EIGRP with its original search algorithm which is Dijkstra, the second one with EIGRP with A * search algorithm using the concept of artificial node creation that can learn from the network.

In the following table the results are presented.

Table 5.1: Simulation results

EIGRP Protocol and EIGRP with A*Search Algorithm		
Parameter/Metrics	EIGRP	EIGRP with A * search algorithm
Throughput(Kbps)	200,465.48	216,481.26
Packet-loss	8	6
Delay	0.23448	0.23338

Using the three main parameters to measure performance of routers and core-switches the simulation result is done. The above tabular data is organized and gathered from the topology with 12 nodes and using CBR and UDP application and traffic. Throughput, Packet-loss and Delay are the main parameters chosen for the simulation.

The main reason for performance enhancement came from the above result is because of EIGRP uses minimal consumption of bandwidth when the network is stable, efficient use of bandwidth during convergence, rapid convergence, support for Variable Length Subnet Mask (VLSM) and Classless Iner- Domain Routing(CIDR) and complete independence from routed protocols. And also A* search algorithm choose the best path by avoid expanding path, it scan the area only in the direction of destination and same time.

So when combine this EIGRP and A* search algorithm, it can be get better performance and improved result based on the above metrics (parameters). The cost also minimize when using EIGRP and A* search algorithm. This is because EIGRP uses the metric the combinations of bandwidth and delay and A* search algorithm use best path to reach the destination from the source, this minimize time to search. Generally, the performance improvement induced by the controller depends on the topology and the available resources, such as the number of nodes and the channel bandwidth.

These parameters are mainly analyzed in detail. So, starting from the table above each of the described as follows.

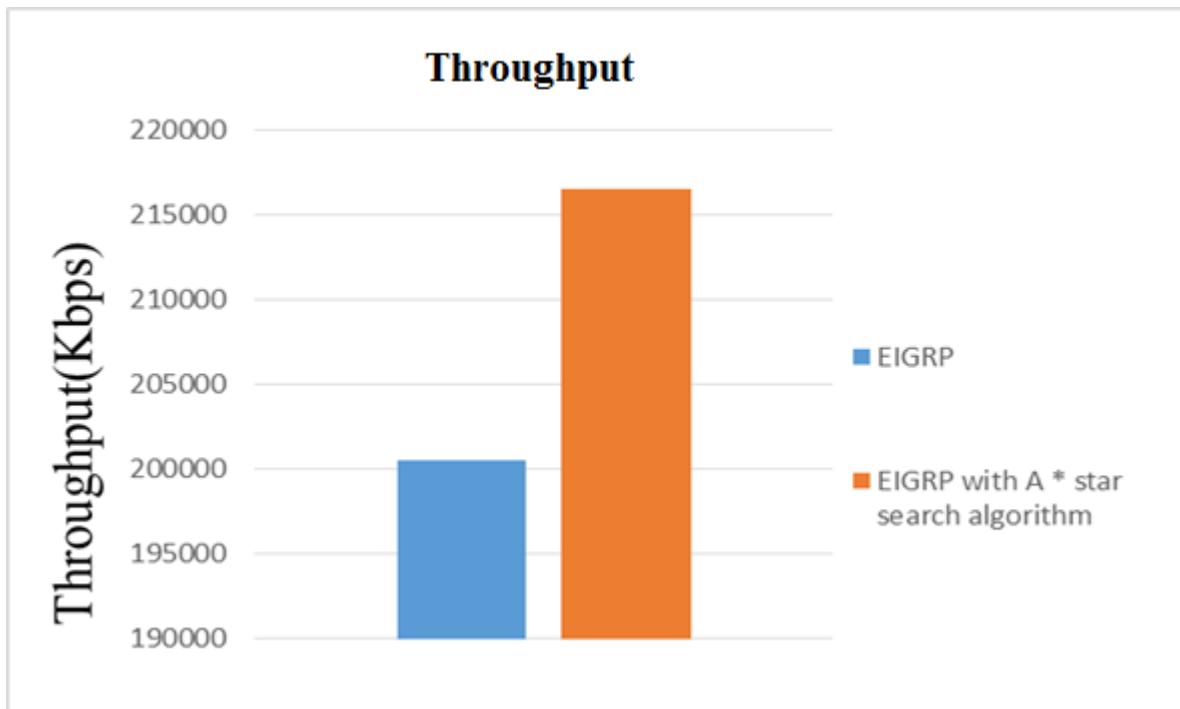


Fig. 5.8: Throughput over EIGRP and EIGRP with A* search algorithm

The throughput is a key parameter to determine the rate at which total data packets are successfully delivered through the channel in the network.

From the above Fig. EIGRP with A* search algorithm has a promising improvement of throughput over the network topology given for simulation. So, using the A* search algorithm is best effective and has a measurable difference than using EIGRP. Introducing an artificial node using the A* search algorithm improves the throughput of the network.

A typical method of performing a measurement is to transfer a 'large' file from one system to another system and measure the time required to complete the transfer or copy of the file. The throughput is then calculated by dividing the file size by the time to get the throughput in megabits, kilobits, or bits per second.

Unfortunately, the results of such an exercise will often result in the good put which is less than the maximum theoretical data throughput, leading to people believing that their communications link is not operating correctly. In fact, there are many overheads accounted for in addition to transmission overheads, including latency, TCP Receive Window size and other system limitations. That means the calculated good put does not reflect the maximum achievable throughput.



Fig. 5.9: Packet loss over EIGRP and EIGRP with A* search algorithm

From the above Fig. it is clear that EIGRP with A * search algorithm has a better performance on packet loss due to many reasons. So, using the network topology with 12 nodes and a routing algorithm of EIGRP with optimal path finding of A * is better than EIGRP.

Packet loss occurs when one or more packets of data travelling across a computer network fail to reach their destination. Packet loss is typically caused by network congestion. Packet loss is measured as a percentage of packets lost with respect to packets sent.

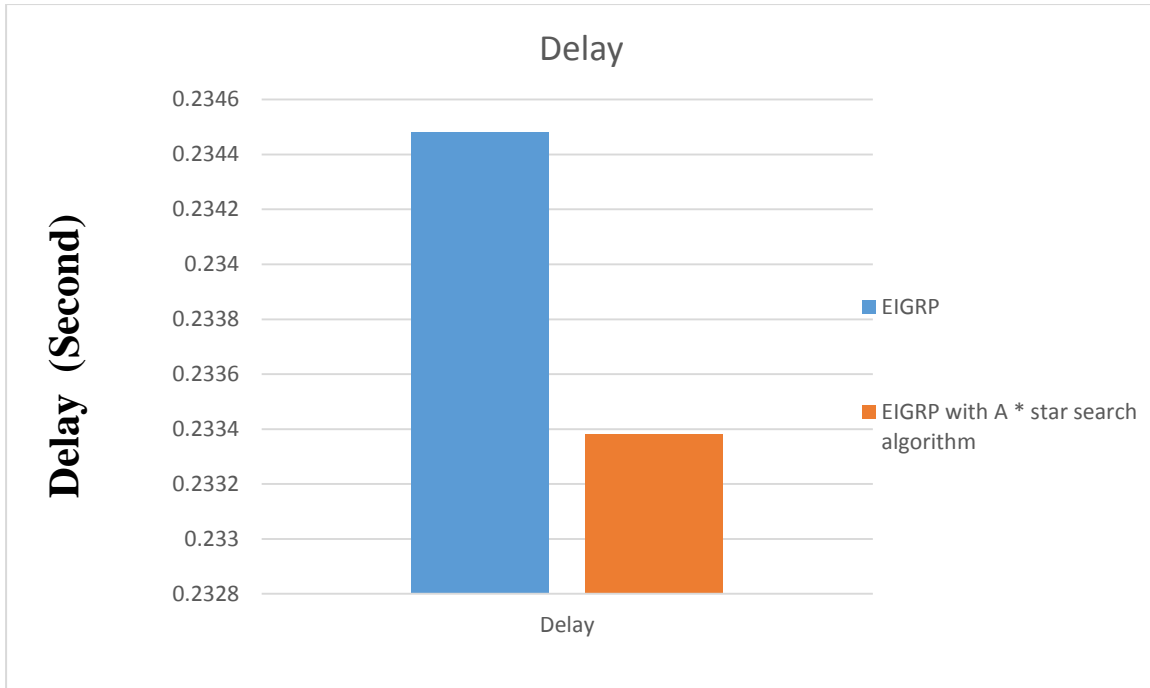


Fig. 5.10: Delay over EIGRP and EIGRP with A* search algorithm

Delay variation is measured by the difference in the delay of the packets. This metric has huge influence on the manners of video applications. Delay for any kind of network or communication is a headache. From Fig.5.10, it is clear that the routing protocol EIGRP with A* search algorithm minimizes the delay and improves performance over EIGRP. By using a routing protocol that supports A* search algorithm it is possible that a Delay Tolerant Network (DTN) can be created.

CHAPTER SIX

CONCLUSIONS AND FUTURE WORKS

In this thesis, introducing an artificial node to the routing protocol which is EIGRP is done using A * search algorithm. The artificial intelligence search algorithm A * defined and described with the comparison of the other search algorithms and path findings so that, it helps to introduce the artificial intelligence node. It is also presented analysis of routing protocols such as EIGRP, OSPF. The study has been done in the same network with different protocols. Performance has been measured on the basis of some parameters that aimed to figure out the effects of routing protocols and the search algorithm selected to it.

Implementation of EIGRP with A * search algorithm shows that it is better and effective than using the normal EIGRP routing protocol. This is because, EIGRP with A * finds the best and shortest path, minimizes network overload by learning the network fast and lookup quickly.

The simulation results have shown that the throughput in the combination of EIGRP with A * search algorithm is much higher than that of EIGRP routing protocol. This result also depicted that throughput can be updated and improved by using EIGRP with A * search algorithm. The simulation result also shown that delay of EIGRP network is relatively greater that of EIGRP with A * search algorithm. As a result, data packets in EIGRP with A * search algorithm network reach faster to the destination. In the context of packet loss, EIGRP with A * search algorithm is slightly lower than that of EIGRP routing protocol.

So, the combination of EIGRP with A * search algorithm used to create and introduce the artificial intelligent node and EIGRP by itself has been analyzed and studied in detail. By combining EIGRP and A * search algorithm, I have come across that the combined implementation of EIGRP and A * search algorithm performs better than EIGRP routing protocol.

In future, a research work can be done on the security analysis of EIGRP. Because of the security vulnerability of the protocol in it is hybrid and mainly dependent on the venders device and the integration of EIGRP with the defined A * search algorithm in device level.

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Annex A: Sample source code for the topology used.

```
set ns [new Simulator]

set nr [open throold.tr w]

$ns trace-all $nr

setnf [open throold.nam w]

$ns namtrace-all $nf

proc finish { } {

global ns nr nf

    $ns flush-trace

close $nf

close $nr

execnamthroold.nam&

    exit 0

}

for { set i 0 } { $i < 12 } { incr i 1 } {

set n($i) [$ns node]}

for {set i 0} {$i < 8} {incr i} {

$ns duplex-link $n($i) $n([expr $i+1]) 1Mb 10ms DropTail }

$ns duplex-link $n(0) $n(8) 1Mb 10ms DropTail

$ns duplex-link $n(1) $n(10) 1Mb 10ms DropTail

$ns duplex-link $n(0) $n(9) 1Mb 10ms DropTail

$ns duplex-link $n(9) $n(11) 1Mb 10ms DropTail

$ns duplex-link $n(10) $n(11) 1Mb 10ms DropTail

$ns duplex-link $n(11) $n(5) 1Mb 10ms DropTail

$ns duplex-link $n(11) $n(6) 1Mb 10ms DropTail
```

```
set udp0 [new Agent/UDP]
$ns attach-agent $n(0) $udp0
set cbr0 [new Application/Traffic/CBR]
$cbr0 set packetSize_ 500
$cbr0 set interval_ 0.005
$cbr0 attach-agent $udp0
set null0 [new Agent/Null]
$ns attach-agent $n(5) $null0
$ns connect $udp0 $null0
set udp1 [new Agent/UDP]
$ns attach-agent $n(1) $udp1
set cbr1 [new Application/Traffic/CBR]
$cbr1 set packetSize_ 500
$cbr1 set interval_ 0.005
$cbr1 attach-agent $udp1
set null0 [new Agent/Null]
$ns attach-agent $n(5) $null0
$ns connect $udp1 $null0
$ns rtproto DV
$ns rtmodel-at 10.0 down $n(11) $n(5)
$ns rtmodel-at 15.0 down $n(7) $n(6)
$ns rtmodel-at 30.0 up $n(11) $n(5)
$ns rtmodel-at 20.0 up $n(7) $n(6)
$udp0 set fid_ 1
$udp1 set fid_ 2
```

```
$ns color 1 Red
$ns color 2 Green
$ns at 1.0 "$cbr0 start"
$ns at 2.0 "$cbr1 start"
$ns at 45 "finish"
$ns run
```

Sample AWK source code for throughput calculation

```
BEGIN {
    recvdSize = 0
    startTime = 0
    stopTime = 500
}
{
    event = $1
    time = $2
    node_id = $3
    node_id = $4
    pkt_size = $6
    level = $5
    # Store start time
    if ($1 == "r" && $5 == "cbr" && pkt_size = 500) {
        if (time < startTime) {
            startTime = time
        }
    }
}
```

```

}

# Update total received packets' size and store packets
arrival time

if ($1 == "r" && $5 == "cbr" && pkt_size = 500) {
  if (time < stopTime) {
    stopTime = time
  }

  # Rip off the header
  #hdr_size = pkt_size % 512
  #pkt_size -= hdr_size

  # Store received packet's size
  recvdSize += pkt_size
}

#printf("Value of the number of packets",recvdSize)
}

END {
  printf("%10s %10g",event, time)

  printf("Value of the number of packets %d",recvdSize)

  printf("Average Throughput[kbps] = %.2f\t\t
  StartTime=%.2f\t\tStopTime=%.2f\n", (recvdSize/(stopTime-
  startTime))*(8/1000), startTime, stopTime)
}

```

Delay calculation AWK source code

```

BEGIN {
  highest_packet_id = 0;

```

```

}

{
action = $1;
time = $2;
  node_1 = $3;
  node_2 = $4;
src = $5;
flow_id = $8;
  node_1_address = $9;
  node_2_address = $10;
seq_no = $11;
packet_id = $12;
if ( packet_id>highest_packet_id ) highest_packet_id =
packet_id;
if ( start_time[packet_id] == 0 ) start_time[packet_id] =
time;
if ( action != "d" ) {
if ( action == "r" ) {
end_time[packet_id] = time;
  }
  } else {
end_time[packet_id] = -1;
  }
}

```

```
END {  
for ( packet_id = 0; packet_id<= highest_packet_id;  
packet_id++ ) {  
start = start_time[packet_id];  
end = end_time[packet_id];  
packet_duration = end - start;  
if ( start < end ) printf("%f %f\n", start, packet_duration);  
}
```