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### VEHICLE DASHBOARD TRAFFIC LIGHT SYSTEMS AT A 4-WAY INTERSECTION

by

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### Dedication

To my wonderful parents who have taught me the meaning of hard work and dedication. To my brother and sisters who have infused their hopes and dreams onto me and have provided nothing but love and support. To my amazing wife who has been my copilot throughout this journey and has sacrificed so much to support me! Last but not least, to God who has allowed me to enjoy a life of great challenges and happy moments like these!

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#### **Abstract**

In recent years, a wave of technological innovations have turned many of the gadgets we use into smart devices. However, some areas of industry remain somewhat isolated from modernization with little to no improvements in their overall functionality. Traffic lights at an intersection are a perfect example of a technology that has remained behind the times. While there is a lot of potential for reducing CO<sub>2</sub> gas emissions, oil consumption, and commuting times, research in this area has resulted in minor changes. In this thesis, we improve on what others have learned to provide a solution in vehicle coordination that is smart, practical and innovative. We leverage the power of Vehicle Ad-hoc Networks (VANET's) to develop a Vehicle Traffic Dashboard Light System that can gather realtime traffic information to effectively coordinate vehicles crossing a 4-way intersection. In detail, we developed a Lazy Algorithm that focuses on reducing vehicular average waiting times, maximizing intersection throughput and minimizes the number of vehicles that need to make unnecessary stops. We then compare the Lazy Algorithm to two other algorithms by conducting various simulations. Furthermore, we study the impact on the average waiting time vehicles experience while crossing two consecutive intersections equipped with a Vehicle Traffic Dashboard Light System. The results from our many

simulations are promising and indicate that such an algorithm could potentially be used for coordinating human-driven vehicles. Under heavy traffic conditions, we have seen a reduction of up to 69.7% in average waiting time in comparison to the tradition Pre-Time traffic light algorithm and 89% in comparison to the FIFO Algorithm. With such results, we feel that the VDTL Systems bring us closer to the era of vehicle automation.

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### Chapter 1 Introduction

The 21st century has brought us many innovations in technology that in some way or other have improved our quality of life. However, certain areas remain stagnant and have made little to no improvements to its overall functionality. A good example of this is the tradition 4-way traffic light.

Vehicle traffic lights have been in existence for many decades now, yet the main algorithm and mechanics used to coordinate vehicle crossing at an intersection have not evolved much. Yes, sensors have been added to the system and many studies have been conducted on determining the optimum light timing but none have been able to yield significant improvements over the current model of the dynamic Pre-Time traffic light. Meanwhile, the number of vehicles on the streets keeps increasing, forcing local governments to install additional traffic lights as a way to maintain traffic flow. In a 2011 report, the United States Federal Highway Administration reported there were a whopping 246 million registered vehicles in the nation [1]. This volume of vehicles traveling on our roadways has become of great concern to many government agencies and the community at large. Not only does it create a traffic flow nightmare but most importantly, the impact that fuel consumption and CO<sub>2</sub> gas emissions have on the environment are quite significant [2].

In recent years, the Obama administration has been particularly interested in breaking the U.S. dependence on foreign oil, increasing vehicle fuel consumption, and addressing the threat of climate change [3-4]. Yet, little is being done to improve the current traffic light system infrastructure that could potentially have a significant

reduction in both fuel consumption and emission of CO<sub>2</sub> gasses released into the environment.

Early versions of the traffic light signals used a fixed pre-configured timing mechanism that would allocate a fixed amount of green time to each direction. As the number of vehicles on our roadways increased, this basic model of coordination proved to be inefficient. It was only then that traffic engineers began using other techniques to better determine the traffic light timing that could maximize the intersection use.

As a way to improve the fixed pre-configured timing model, engineers began using induction loop sensors that could determine when a vehicle was present [5]. These sensors would then allow the light controller to adjust to traffic light timing throughout the day based on traffic patterns obtained from these sensors. Unfortunately, such sensors were very intrusive, expensive and resulted in higher maintenance costs [6]. As an improvement, traffic engineers began using non-intrusive type sensors such as motion, video, and microwave sensors, to name a few. While these sensors were less expensive, they were also less accurate [6].

With the development of wireless networks, the idea of using such a technology for traffic coordination has gained more and more support. In recent years, many researchers have proposed the use of Vehicle Ad-hoc Networks (VANET') such as Vehicle to Vehicle (V2V) and Vehicle to Infrastructure (V2I) to collect data that could then be used to adjust the traffic light timing in real-time [7].

Regardless of the method being used for controlling the traffic light timing, the fact is that vehicles are still required to stop. In some cases, vehicles are required to stop and wait for the green light even if there is no other vehicle at the intersection. Similarly,

vehicles taking a trajectory that does not conflict with other vehicles will also be required to stop. As a result, there is a lot of potential to further reduce fuel consumption and CO<sub>2</sub> gas emissions into the environment by reducing the vehicle waiting at the intersections.

In a paper published by the University of New Mexico in collaboration with the University of Shanghai in China, the author suggests evaluating vehicles on an individual basis so that non-conflicting vehicles at the intersection can continue without having to stop [11]. While the model sounds very promising, the number of vehicles that are required to stop at the intersection during moderate and high traffic conditions is still quite high. Furthermore, the model assumes that all vehicles will take 4 seconds to cross the intersection when in reality, this time, can vary on vehicle type and velocity.

In this paper, we improve on a previously proposed algorithm for dispatching vehicles in a 4-way intersection by not only evaluating each vehicle individually but also as a group. The solution being proposed in this paper is called Vehicle Dashboard Traffic Light (VDTL) System and it consists of an intersection and vehicle transceiver that communicate wirelessly to systematically dispatch vehicles across the intersection. The system evaluates each vehicle independently and as a group (platoon) to determine if the vehicle can cross the interaction without stopping by making use of what we call a lazy algorithm. The decision is then wirelessly sent to each vehicle and displayed on the vehicle's traffic light dashboard. The purpose of this proposed algorithm is to reduce the average waiting time for each vehicle in an effort to increase traffic flow, reduce fuel consumption, and reduce CO2 emissions.

As we would expect, such change to the vehicle traffic light system shakes the foundation of how we think about vehicular traffic flow and presents an option to moving it to the 21<sup>st</sup> century.

In chapter 2, we analyze the work others have conducted in this area and identify gaps that could potentially be addressed by the work on this thesis. Chapter 3 will look into the details of the overall system design, the technologies it relies on to effectively operate a VDTL system and describe algorithm being proposed. In chapter 4, we describe the simulation configuration that was developed to compare the Lazy Algorithm with other algorithms such as the Pre-Time and FIFO Algorithm. Chapter 5 will go over the different simulation scenarios that were performed to identify the parameters that produced the best results. In chapter 6 we go over the performance study results. Finally, in chapter 6 we go over the results obtained in simulation and conclude with chapter 7 by identifying future areas of research interest.

### Chapter 2 Literature Review

The 4-way Pre-Time traffic control system that we all encounter on a daily basis has proven to be very restrictive in terms of maximizing the use of the intersection or what we refer to in this paper as the critical zone. The issue with the Pre-Time traffic control system is that vehicles are forced to stop at an intersection when there is possibly no other vehicle is making use of the critical zone. As the number of vehicles on our roads increase, the importance of maximizing the use of the critical zone has become more and more important. Not only is overall fuel consumption increased but the amount of CO<sub>2</sub>

gasses released into the environment becomes very significant as we aggregate the number of vehicles that travel across US road intersections.

In recent years, a lot of research has been conducted in an effort to eliminate unnecessary vehicle stops at intersections. Table 2.1 provides a brief summary of the many parameters that have been considered when developing solutions to reduce vehicle waiting time at the intersections.

Evaluating Unit	Technology	Frequency of Light Switching	Type of Vehicle	Traffic Conditions	Road Infrastructure
- Individual - Platoon	- Sensors (Intrusive or Non-Intrusive) - Vehicle ad- hoc Networks (VANET) (V2V or V2I)	- Per Cycle - Per Platoon - Per Vehicle	- Automated - Human Driven	- Light - Moderate - Heavy	-Traffic Light -No Traffic Lights

Table 2.1: Parameters used in Traffic Coordination Schemes

### 2.1 Sensors

In a study conducted by Universiti Pultra Malaysia, the authors make a comparison between time-based and sensor-based traffic light control systems. In their research, they modulate the light timing based on a set platoon size. More specifically, their algorithm checks the number of vehicles waiting to cross the intersection to determine the amount of time the green light should stay on. If the number of vehicles waiting to cross the intersection is small, the resulting green light durations will be short. If the number of vehicles waiting increases, so does the green light duration [6].

With such an algorithm, they reduced the vehicle average waiting time by 62% under moderate traffic conditions and 15% under heavy traffic conditions. While such results sound very promising, the fact is that vehicles are still required to stop even if no other vehicles are present since the system is dependent on a light timing model. Figure 2.1 serves as evidence of how intersections with installed sensors still require that vehicles stop even when other vehicles are headed to non-conflicting lanes. By looking at the picture, we can see how under the current conditions Vehicle A and Vehicle C could possibly be able to cross the intersection without having to stop. The sensors installed at the intersection are circled in red to provide clarity.



Figure 2.1: Example of Vehicle Waiting at an Intersection with Sensors

Furthermore, the simulation conducted in this study does not consider different types of vehicles and the different time required for each to clear the critical zone.

Lastly, with the development of wireless networks, the use of sensors has become

somewhat a thing of the past. The use of wireless technologies to obtain data directly from vehicles approaching the intersection has become a more valuable approach to modulating traffic controller light timing.

### 2.2 Vehicle Ad-Hoc Networks (VANET's)

The use of VANETs for coordinating vehicles across intersections has become a very popular research topic. More specifically, the use of Vehicle-to-Vehicle (V2V) and Vehicle-to-Infrastructure (V2I) networks have proven to be particularly useful in obtaining vehicle information that otherwise would be unobtainable. For instance, by making use of ad-hoc networks, intersection controllers can now obtain real-time information such as vehicle speed, lane, type and distance to name a few. Additionally, the possibility of communicating traffic condition from vehicle to vehicle with the use of this technology becomes particularly important when needing to redirect traffic after a major highway accident. As one can imagine, the possibilities are endless.

Studies that have implemented the use of V2V and V2I communication include those done by the University of Bucharest in collaboration with Rutgers University. In their study, the V2V network is used to relay a message from one vehicle to another to alert the intersection controller of the upcoming vehicle approaching the intersection. The vehicle closest to the intersection uses the V2I network to inform the intersection controller of the amount of vehicles approaching the critical zone from each direction. The intersection controller then uses this information to adjust the green light timing for the next cycle. In other words, the controller uses information obtained from the previous cycle to generate a forecast of what the green light timing should be for the next cycle.

The cycle length is calculated by finding the flow per capacity ratio based on Webster's formula [8]. Simulation results indicated that a reduction of 28.3% in total delay from a Pre-Time intersection could be achieved by implementing such a strategy.

In a similar manner, Pandit, Ghosal, Zhang, and Chuah make use of VANET's to dynamically adjust the intersection controller light timing. However, in their Adaptive Traffic Signal Control with Vehicular Ad hoc Networks paper, they group vehicles into platoons rather than considering each vehicle individually like Grandinescu [7, 8]. In their proposed oldest job first (OJF) algorithm, they suggest creating vehicle platoons of equal size and allowing groups with the oldest arrival time to cross first. They leverage the power of VANET's to effectively create the vehicle platoons. By doing this, they discovered that the delay vehicles experienced at the intersections was significantly reduced during light and moderate traffic conditions. Under heavy traffic, they found that their OJF algorithm had less of an impact. In comparing this algorithm to the Pre-Time traffic algorithm, simulation results suggest a possible reduction of up to 39% in the average delay per vehicle [7].

Another interesting research that makes use of VANET's in combination with Stochastic and Heuristic Algorithms is one conducted by Kwatirayo et. al. Their study results yield a reduction in average travel time ranging from 17.6% to 21.8%. In this study, they propose a reduction in average travel time by using an optimization method called Simultaneous Perturbation Stochastic Algorithm (SPSA) to find the optimal solution for setting the maximum green light time [9]. However, the use of optimization methods does not eliminate the unnecessary wait time from vehicles waiting for the light

to change but rather simply minimizes that wait time as much as possible. However, vehicles with non-conflicting trajectories are still required to stop.

Recent research related to vehicle coordination via VANET's is now focusing on the coordination of automated vehicles without the use of traffic lights at each intersection [10]. In theory, V2V and V2I networks in combination with collision avoidance technologies could be used to virtually eliminate all waiting time experienced by vehicles crossing the intersection. With such a coordination scheme, multiple vehicles could be traveling inches apart from each other within the critical zone without the risk of collision. For instance, two vehicles traveling perpendicular to one another could possibly cross the critical zone without stopping as long as there is a slight space gap between each of them. Although this could be the ideal solution to intersection coordination, the reality is that we are a few years away from seeing fully automated vehicles in our roadways. Therefore, solutions that take into consideration the many uncertainties that come with human-driven vehicles will likely be the most effective solutions for the short term implementation.

A similar approach to coordinating vehicles at an intersection without making use of traffic lights while still considering human driven vehicles is one done by Al-Mashhadani et. al. They transition the traffic lights from the street to the vehicle by introducing a Dashboard Traffic Light (DTL) device that communicates wirelessly with the intersection controller. Their innovative FIFO Algorithm evaluates vehicles individually as they approach the intersection. The intersection controller reserves the critical zone on a first come first serve bases and allows vehicles with non-interfering trajectories to continue without stopping. What's more, their multiple simulations

ranging from 5 to 90 vehicles per minute yield a promising 86.5% reduction in average waiting times in comparison to Pre-Time intersection under heavy traffic conditions. In analyzing the work done in this research, it is clear that realistic variability in time required for each vehicle to cross the critical zone is not considered. For their study, they assume that it will take all vehicles 4 seconds to cross the intersection regardless of their profile type and speed. Furthermore, during heavy traffic conditions, the simulations results indicate that the percent of vehicles required to stop is higher when using their proposed algorithm in comparison with the Pre-Time. In other words, the FIFO Algorithm becomes counterproductive under moderate and heavy traffic patterns. And while no algorithm will completely eliminate vehicle waiting time under heavy traffic patterns, it certainly should not make it worse.

In this thesis, we propose a heuristic algorithm that helps address the gaps found between the Pre-Time Algorithm and the FIFO Algorithm. The Lazy Algorithm takes a combination of both of these approaches to evaluate vehicles individually and as a group (platoon) to achieve a lower waiting time experienced by all vehicles. The strategy leverages the power of VANET's to gather vehicle information that is crucial to the constant adjustment of vehicle processing during light, moderate, and heavy traffic conditions. Furthermore, it uses the Vehicle Dashboard Traffic Light (VDTL) system as a way of eliminating the use of intersection traffic lights and expediting the dispatch process of each vehicle. In the following chapter will touch on the details of the overall systems, parameters, and assumptions that are being considered to make an improvement in vehicle waiting time.

## Chapter 3 VDTL System Design

The Vehicle Dashboard Traffic Light (VDTL) is a system in which no actual traffic lights are installed at each intersection but rather displayed within a vehicle's dashboard. Intersections are equipped with transponders connected to an intersection hub responsible for coordinating the use of the intersection critical zone. This is very similar to a computer processor model in which tasks need to be performed by a single processor. Figure 3.1 illustrates how a VDTL system might look. Note that the traffic light in each vehicle represent the dashboard and the antenna like symbols represent the vehicle transceiver. Lanes are numbered clockwise direction starting from the east end.

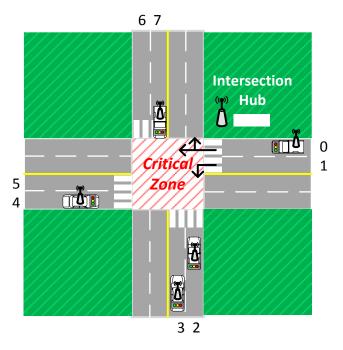


Figure 3. 1 Vehicle Dashboard Traffic Light (VDTL) System

The intersection hub schedules vehicles based on an elaborate Lazy Algorithm that not only evaluates vehicles individually but also in a platoon configuration.

However, to fully comprehend the design, a basic understanding of how we define platoons needs to be reviewed. Figure 3.2 below explains what we consider to be a platoon.

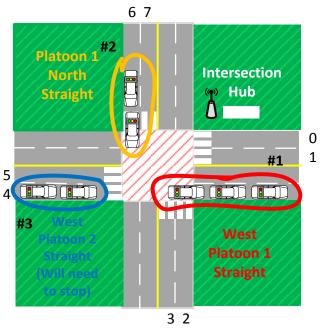


Figure 3.2 Platooning

A platoon is a group of vehicles that is allowed to consecutively cross the intersection critical zone without the interruption of any other trajectory conflicting vehicle. As seen in figure 3.5, the west platoon 1 is made up of 3 vehicles rather than 5. This platoon cut off is caused by platoon 1 approaching from the north and arriving at the critical zone before platoon 2 approaching from the left. Both the Pre-Time and Lazy Algorithms make use of this platooning mechanism to improve efficiency.

This VDTL system assumes that all vehicles are still driven by humans and that all vehicles are equipped with a VDTL system device. And although the system is designed specifically for a four-way intersection that has a dedicated lane for turning left

and another for going straight or right, it can also be implemented in other configurations as parameters were built into account for changes in intersection configuration.

#### 3.1 Vehicle Transceiver

The vehicle transceiver is a device installed on each vehicle and contains a unique ID. When approaching an intersection with the VDTL system, the transceiver is responsible for transmitting information such as speed and distance of the vehicle to the intersection. Once a response is received from the intersection, the transceiver displays the appropriate intersection light status and a countdown of the red light.

This paper assumes that vehicles approaching the intersection are processed on a first in first out basis. In other words, the possibility of a vehicle in the back communicating with the intersection before the vehicle in front is not being considered. However, this limitation could potentially be eliminated by the use of GPS data.

#### 3.2 Intersection Hub

The intersection hub or traffic controller is the brain behind the entire system. This component uses the algorithm developed in this paper to schedule and dispatch vehicles across the intersection critical zone. The transceiver would most likely be located near the intersection and be equipped with an antenna capable of receiving and transmitting information at a distance of at least 300 meters. As vehicles broadcast their approach to the intersection, the intersection transceiver would capture the vehicle data, run it through the algorithm and broadcast the response to each individual vehicle.

It is assumed that the intersection transceiver is connected to a server capable of processing requests at a rate that is as least twice the vehicle arrival rate for the

intersection during heavy traffic conditions. Additionally, the server would have the capabilities of storing a log of vehicle stats and calculating in real time the average vehicle waiting time and max waiting time per vehicle.

### 3.3 Overall VDTL Specifics

The VDTL system is highly dependent on VANET's for transmitting and receiving data between the intersection hub and the vehicles approaching the intersection critical zone. At a preconfigured distance from the intersection critical zone, vehicles would broadcast the information in table 3.1 to the intersection hub as a way of announcing their trajectory toward the intersection critical zone.

Vehicle ID	Unique vehicle identification number.	
<b>Arrival Time</b>	Time stamp when the vehicle sent the information to the	
	intersection hub.	
Location	Location obtained via GPS or some other faster mechanism. This	
	thesis considers all vehicles reporting at a distance of 300 meters.	
From	Arrival direction (North, South, East, West).	
To	Vehicle destination (Left, Right, Straight).	
Speed	Vehicle constant speed of approach to the intersection	
Lane	Lane where the vehicle will remain in until it passes the	
	intersection critical zone.	
Type	Identify the type of vehicle. (Passenger vehicle or public	
	transportation bus).	

Table 3.1: Data Broadcasted by VDTL Vehicle

Once the intersection hub obtains the vehicle data, the intersection hub starts by determining the vehicle's estimated time of arrival (ETA) to the edge of the intersection critical zone. It then calculates what we call the time-to-pass (T2P), which refers to the time it takes the vehicle to pass the critical zone.

The system was designed to determine the T2P value based on vehicle type, trajectory, and light status. A bus at rest that is turning right will have a 50% higher T2P

value than a passenger vehicle headed straight that is also at rest. If  $S_{LM}$  is the amount of time it takes a sedan in motion to turn left,  $S_{LR}$  is the amount of time it would take a sedan to turn left when starting at rest once it's located at the edge of the intersection critical zone. Similarly,  $B_{LM}$  is the amount of time it would take a bus in motion to turn left and  $B_{LR}$  the time needed to turn left from rest. Equations 1, 2 and 3, below describe how we calculated the timing for both sedans and buses at motion and rest. Such T2P equations were determined by conducting a time study at a four-way intersection in Albuquerque, NM.

$$S_{LM} = x \mid S_{LR} = x + 0.33 * x$$
  $B_{LM} = x \mid B_{LR} = x + 0.25 * x$  (1)

$$S_{SM} = y \mid S_{SR} = y + 0.50 * y$$
  $B_{SM} = y \mid B_{SR} = y + 0.33 * y$  (2)

$$S_{RM} = z \mid S_{RR} = z + 0.10 * z$$
  $B_{RM} = z \mid B_{RR} = z + 0.50 * z$  (3)

The system is designed to assign a different T2P to vehicles that are part of a platoon. As Figure 3.2 explains, the first vehicle in the platoon will be assigned a T2P time that is based on vehicle trajectory, vehicle type, and waiting conditions. The rest of the vehicles within that same platoon will get assigned a 1 second T2P, thus creating some sort of capsule in which the first vehicle in the platoon always has a slightly higher T2P. As previously mentioned, only the Pre-Time and Lazy Algorithms make use of the platooning mechanism and therefore are capable of adjusting the T2P as explained in the figure below.

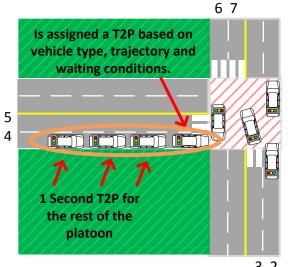


Figure 3.3: T2P for Vehicles in a Platoon

With knowledge of the vehicle's ETA and T2P, the hub then searches for an available time slot for the vehicle to cross the critical zone. If the ETA of the approaching vehicle is before the last vehicle arrival, then the system adds it to the back of the queue and adds a one-second delay as a safety guard. If the ETA is after the last vehicle arrival, then the approaching vehicle is simply appended to the end of the queue. If the time slot reserved by the intersection hub comes after the vehicle's ETA, then the vehicle will be forced to stop before crossing the intersection critical zone. The time slot taken by the newly arrived vehicle is then reserved and time slots from other conflicting trajectories are blocked for the duration of the vehicle's T2P. As an example, a vehicle arriving from the south and turning left would require that not only the time slot for his lane be reserved but also the time slot for vehicles headed straight from the west. Figure 3.4 attempts to clarify the concept of time slot reservation by illustrating how multiple vehicles in non-conflicting trajectories can arrive at slightly different times, yet still cross the critical zone without stopping.

Vehicles from conflicting trajectories will be evaluated on a first come first served basis and therefore, one or more will be forced to stop and wait. Figure 3.4 provides a detailed example of how time slot blocking works when vehicles with conflicting trajectory approach the intersection critical zone. It will also provide an example of when two non-conflicting vehicles approach the intersection. For simplicity reasons, all vehicles in the example take 2 seconds to cross the intersection critical zone and arrive in consecutive order starting at t=1.

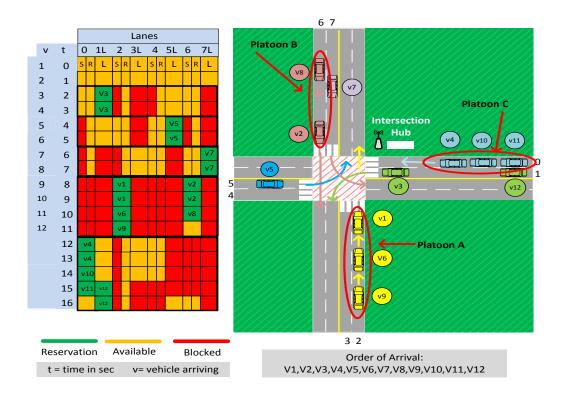


Figure 3.4 Example of Time Slot Blocking under FIFO Algorithm

In the example above, vehicle 1 arrives at second 1 to the intersection so he gets a green light and block all other conflicting lanes for 2 seconds. Vehicle 2 arrives at second 2 but has to wait for vehicle 1 to clear the intersection so he blocks the next available time slot and all other slots that conflict with his trajectory. The third vehicle arrives at second 3 but is forced to wait for vehicle 2 to clear the intersection, therefore,

he blocks the next available time slot along with all other that conflict with its trajectory. Vehicle 4 arrives at second 4 but has to wait for vehicle 3 to cross the intersection critical zone. Vehicle 6 arrives but has to wait for vehicle 4 to pass but then a second later, vehicle 6 arrives. Because these last two vehicles do not conflict with each other's trajectory, both are allowed to leave at the same time starting at second 9. It is important to highlight that this concept of time blocking is specifically utilized by the FIFO and Lazy Algorithms.

The VDTL system uses the following equations to determine what lanes to block when a new vehicle arrives:

Let:

F = be the direction from where the vehicle is approaching

 $B_{SR}$  = the straight right time slot in the array that needs to be blocked

 $B_L$  = the left time slot in the array that needs to be blocked

For vehicles headed left execute setL2Red():

$$B_{SR} = (F+1) \% 4 \quad | \quad B_L = (F+1) \% 4$$
 (4)

$$B_{SR} = (F+2) \% 4 \quad | \quad B_L = (F+3) \% 4 \quad (5)$$

For vehicles headed right execute setR2Red():

$$B_{SR} = (from + 2) \% 4 (6)$$

For vehicles headed straight execute setSR2Red():

$$B_{SR} = (F+1) \% 4 \quad | \quad B_L = (F+2) \% 4$$
 (7)

$$B_{SR} = (F+3) \% 4 \quad | \quad B_L = (F+3) \% 4 \quad (8)$$

After completing the time slot reservation and lane blockings, the intersection hub would then send the vehicle a traffic light status. If the vehicle obtained a green light,

which would mean that it can continue its trajectory toward the intersection critical zone without stopping. If the vehicle receives a red light with a countdown, this would result in the vehicle having to stop at the edge of the critical zone for a set amount of seconds. The countdown clock would not start counting down until the vehicle is at rest at the edge of the intersection critical zone. The concept of deceleration as the vehicle approaches the intersections is not being considered in our simulation.

The intersection hub vehicle light status response process would look something similar to what is described figure 3.5.

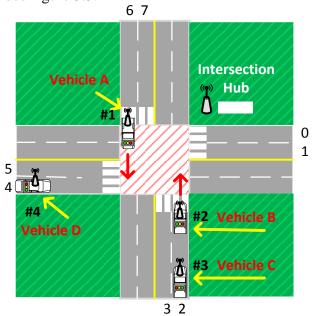


Figure 3.5: Intersection Hub Light Status Response

In this case, vehicles A, B, and C would see a green light in their dashboard since the intersection hub would detect non-conflicting trajectories. On the other hand, because vehicle D was the last one to report to the intersection hub and the critical zone is already busy, it will be forced to stop. As a result, vehicle D would see a countdown red light indicating to the driver that it must stop at the edge of the intersection critical zone and wait until the light turns to green.

A final step for the intersection hub is to calculate the vehicle's estimated time of departure (ETD). The ETD is the time when the vehicle has completely cleared the intersection critical zone. Ideally, this task could be performed after a light status response is sent to the vehicle and kept for statistical reasons.

Throughout this process, it is assumed that vehicles will maintain lane position, trajectory, and constant speed. The equation below is used to determine the time window available for a two-way communication between the vehicle and intersection hub.

Speed in 
$$mps = speed (mph)$$
 (9)

$$time(sec) = \frac{distance (meters)}{speed (mps)}$$
 (10)

As an example, it would take a vehicle 19.8 seconds to get to the intersection critical zone when traveling at 35mph and at a distance of 300 meters. In our design, we assume that all vehicles will initialize communication with the intersection hub at 300 meters and that their speed varies between 35mph and 25mph. As such, it is highly suggested that all communication between the vehicle and intersection hub happen within a 10-second window. If the communication time window is missed, there is a very high potential of two of more vehicles colliding. As previously mentioned, all requests to make use of the intersection critical zone would be processed on a first come first serve basis. Communication contention from two vehicles with conflicting directions is not being considered in this paper.

### 3.4 Lazy Algorithm

Perhaps the most valuable contribution to this research is the heuristic Lazy Algorithm

being proposed. This algorithm attempts to reach a middle ground between the Pre-Time existing model and other proposed methods that we believe worsen conditions rather than improving them [11]. To do this, a unique approach was taken where vehicles are evaluated not only on an individual basis but also as a platoon. This concept becomes particularly important during heavy and moderate traffic conditions where other solutions have proven to become equivalent to a 4-way stop.

The algorithm uses a combination of parameters, such as vehicle queue count and time delay, to determine if vehicles headed in a straight or right direction are required to wait before entering the intersection critical zone. By using a combination of vehicle queue count and time delay, we open the possibility of allowing two or more vehicle access to the critical zone as a group rather than individually. The actual flow for the Lazy Algorithm is as follows.

Let:

Schedule() = function used to determine the time slot to be used by a vehicle

CarNew() = function that generates vehicles based on Poisson Distribution

HandleCross() = function that dispatches the vehicles once they have been scheduled

T = Time delay configured

Q = Vehicle Q size configured

V<sub>A</sub> = Vehicle arrival array

 $V_F$  = Direction from where the vehicle is arrives at the intersection

 $V_{T}$  Direction where vehicle is headed after crossing the intersection

 $Q_{NS}$  = Number of vehicles in the north/south queue at time t

 $D_{NS}$  = Delay time before releasing queue in north/south direction

 $Q_{EW} = Number of vehicles in the south/west queue at time t$ 

D<sub>EW</sub> = Delay time before releasing queue in east/west direction

```
Lazy Algorithm
```

**Input:** Vehicle approaching the intersection critical zone

**Output:** Time slot to cross the intersection critical zone

If V<sub>A</sub> is empty

CarNew()

If V<sub>A</sub> is not empty

**If** V<sub>T</sub> left:

**Schedule()** the vehicle to cross the intersection **setL2Red()** block all interfering lanes for time slot

**Continue** 

**If** V<sub>T</sub> right or straight:

If  $V_{F} = east \text{ or } V_{F} = west$ 

**Increase** Q<sub>EW</sub> by one

If  $Q_{EW} >= T$  or  $D_{EW} >= Q$ 

**Schedule()** vehicle to cross the intersection

**If** first vehicle in platoon

Set T2P based on configured parameters

If the last vehicle in platoon

**Set** T2P based on configured parameters

Else

**Set** T2P to 1 sec

If VT = Right

setR2Red() block all interfering lanes for time slot

**If** VT = Straight

setSR2Red() block all interfering lanes for time slot

Continue

Else:

**Stop** vehicle until  $Q_{EW} >= T$  or  $D_{EW} >= Q$  is met

**Continue** 

**If**  $V_{F} = North$  or  $V_{F} = South$ 

**Increase** Q<sub>EW</sub> by one

If  $Q_{NS} >= T$  or  $D_{NS} >= Q$ 

**Schedule()** vehicle to cross the intersection

**If** first vehicle in platoon

**Set** T2P based on configured parameters

**If** the last vehicle in platoon

**Set** T2P based on configured parameters

Else

**Set** T2P to 1 sec

If VT = Right

setR2Red() block all interfering lanes for time slot

**If** VT = Straight

setSR2Red() block all interfering lanes for time slot

**Continue** 

Else:

 $\textbf{Stop} \text{ vehicle until } Q_{NS} >= T \text{ or } D_{NS} >= Q \text{ is met}$ 

**Continue** 

**for** each direction

HandleCross() Dispatch Vehicle according to the scheduling array

Figure 3.6: Lazy Algorithm Pseudo Code

The important aspect to understand about the Lazy Algorithm is that vehicles headed in a straight and right direction are forced to wait a set amount of time or until a vehicle quorum count is met before being allowed to use the intersection critical zone.

Additionally, the T2P for the first vehicle in the platoon is based on vehicle type, trajectory, and vehicle motion. All vehicles processing the leading vehicle in a platoon are assigned a 1 second T2P because it is expected that vehicles will already be in motion by the time they get to the edge of the intersection critical zone. Finally, keep in mind that the Lazy Algorithm parameters are configured to avoid becoming a 4-way stop during heavy and moderate traffic conditions.

To visualize the effects of such a heuristic algorithm, we included an example with in Figure 3.7 in which individual vehicles are assigned a 2 second T2P and vehicles are encapsulated in a platoon are assigned a T2P of 1 second. Furthermore, vehicles headed in a straight and right direction are forced to wait until a vehicle quorum of 3 is met or 8 seconds have passed.

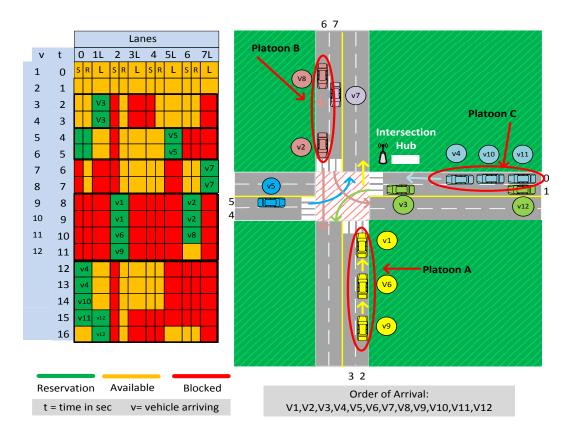


Figure 3.7: Example of Time Slot Blocking under Lazy Algorithm

Figure 3.7 illustrates how vehicles 1 and 2 are forced to stop because neither 8 seconds have passed nor a 3 vehicle quorum is met. Therefore, vehicle 3 is allowed to cross the intersection first. Right after vehicle 3 crosses, vehicle 4 arrives but again, neither 8 seconds have passed nor are 3 vehicles in the queue. Because of this, vehicle 5 gets to cross immediately after arriving. Soon after, vehicles 6 and 7 arrive but while 7 gets to cross, vehicle 6 gets added to the queue along with vehicle 1. While vehicle 7 crosses, vehicles 8 and 9 arrive meeting both the vehicle quorum for Platoon A and the time delay for Platoon B, therefore allowing both platoons to make use of the intersection critical zone. Lastly, vehicles 10, 11, and 12 are scheduled to cross at the end. In short, the Lazy Algorithm causes vehicles headed in a straight/right direction to wait until 8 seconds have passed or at least 3 vehicles are in the queue.

While the proposed heuristic algorithm provides what we believe to be an improvement to the intersection average waiting time, it is not the optimal solution to the problems. In this thesis, we focused on obtaining a solution that could provide an improvement over the well-known Pre-Time Algorithm and FIFO Algorithm developed by [11]. Furthermore, the fact that our algorithm targets traffic headed in the straight and right direction is based on the assumption that a particular traffic intersection has more vehicles headed in the straight and right direction. During the design process, attempts were made to delay vehicles making a left turn. However, such an approach resulted in an increase in average waiting time which we attribute to the small amount of vehicles headed in the left direction in comparison to those headed straight or right direction.

### 3.5 System Dependencies & Limitations

As previously mentioned, the VDTL system would be highly depended on an ad-hoc wireless network capable of reaching a preconfigured distance. Vehicles crossing the intersection would be required to have a VDTL device installed and communicate to the intersection transceiver at a distance of at least 300 meters. Vehicles approaching the intersection will need to maintain a constant speed that is between the system's specified speed ranges and not change lanes. The possibility of having vehicles stranded on the intersection is not being considered as part of this paper and overall system design.

Once a vehicle receives a response from the intersection hub on its scheduled time to cross the intersection, all communications between the two are terminated and no further updates are possible. In other words, the system is not designed to alter an already issued cross schedule. Once vehicles are given a green light, the deceleration speed that is caused by turns is indirectly considered. Vehicle deceleration is considered

in the amount of time we specify that it takes a vehicle to cross the intersection. Vehicles turning left and right will require more time to cross the intersection critical zone than a vehicle headed in a straight direction. Finally, it is assumed that vehicles will continue to be driven by humans.

### 3.6 System Parameters

There is a clear understanding that not all intersections are built in a perpendicular direction and that all possesses a different traffic flow. For this reason, the algorithm offers the capability of adjusting the vehicle arrival rate per direction, the vehicle queue size and waiting time per direction. As previously mentioned, our algorithm reduces the average waiting time by not only considering what is beneficial to individual vehicles but rather the platoon as a whole. To make this possible, a combination of queue time delay and vehicle count are considered when determining if a vehicle gets a green light.

Another important and crucial feature that we feel adds a more realistic approach to our solutions is the consideration of the variable time required for vehicles to cross the intersection critical zone. The time to pass (T2P) is the time it takes a vehicle to clear the intersection critical zone based on its type and speed. For instance, a vehicle at rest would require more time to clear the intersection than a vehicle that is already in motion. Furthermore, a vehicle at rest will require less time to pass the intersection than a bus at the intersection. This is why it is very important the intersection hub knows what type of vehicle is making the request as this will help it determine the time to pass. For this reason, the T2P parameter is also modifiable.

In our design, we considered vehicles approaching the intersection at speeds between 11.2 mps-15.6mps and a distance of 300 meters. Nevertheless, we understand there is a possibility of using this system at intersections that allow a narrower or wider range. Therefore, we have included a parameter to adjust the speed range and the distance where communication is initiated. Table 3.3 goes over the list of parameters that can be modified in the code.

Queue Time Delay	The number of second to wait before the straight and right vehicle queue can be released. Separate time can be configured for the north/south and east/west directions.
# Vehicles	The number of vehicles to wait before the straight and right vehicle queue can be released.
T2P	Time required for a vehicle to pass based on different conditions.
Distance	This is the distance at where vehicle broadcast their data to the intersection hub
Vehicle Allocation	The percentage of vehicles heading straight, right or left
Green light percentage	For the Pre-Time Algorithm, the amount of green time allocated to each direction and trajectory can be modified.

Table 3.2: Lazy Algorithm Modifiable Parameters

### 3.7 Communication Protocol

As specified in the algorithm, the intersection hub was designed to schedule a vehicle and transmits a single message update as seen in Figure 3.8. When the vehicle broadcasts its arrival to the intersection hub, the hub then determines when to schedule the vehicle to cross the intersection critical zone. The decision is transmitted to the vehicle to be displayed on the dashboard. Once the vehicle has crossed the intersection critical zone, it sends a short message to the intersection hub. This last message serves as confirmation to the intersection hub that the vehicle has passed. However, this design puts a lot of restrictions in the way vehicles can behave in the road.

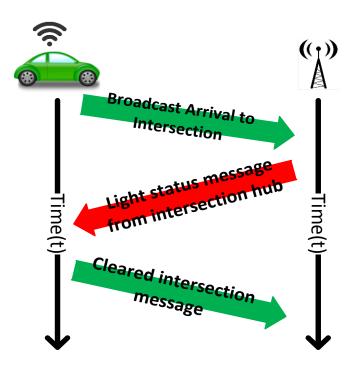


Figure 3.8 Single Communication Protocol

For instance, our design requires that all vehicles entering the intersection maintain a constant speed. With a multiple message processing and communication protocol, vehicles could potentially modify their speed after broadcasting their information to the intersection hub. Additionally, vehicles could pass and or change lanes in intersections with multiple lanes. In the meantime, the intersection hub would be capable of adjusting to the vehicle's updated changes and provide a reschedule light status. Figure 3.9 demonstrates how a multiple communication protocol would work.

While the multiple message protocol between vehicles and intersection hub could potentially open many possibilities, it also introduces a higher level of complexity. As previously mentioned, based on a 300-meter window, vehicles traveling at a max speed of 35mph have approximately a 9-second window to send their information and receive a light status. If vehicles are permitted to adjust their speed and or change lanes, the

communication windows would now be less than 9 seconds. Additionally, if we introduce the human reaction time to this, the window for communication could potentially be a lot smaller. This implies that both our vehicle and intersection hub could exchange messages in less than a second and continue to do so for multiple seconds. The scope of conducting such study and simulation required significantly more time therefore we felt was more adequate for Ph.D. work.

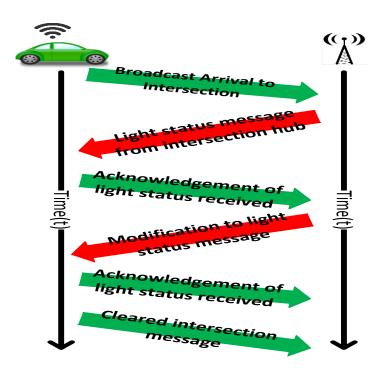


Figure 3.9 Multiple Communication Protocol

## Chapter 4 Simulation Configuration

To simulate and measure the performance of the Lazy Algorithm, we developed a program built in C to simulate a 4-way intersection with a VTLC system. The program focuses on the performance of the algorithm rather than the communications medium as we felt that the emphasis of this study should be on the actual functionality of the VTLC

systems in combination with the algorithm. While the developed program turned out a bit complex, the basic functionality was built on three main components: vehicle arrival, vehicle scheduling, and vehicle dispatch.

#### 4.1 Vehicle Arrival

The first component of our simulation consisted of developing a mechanism to simulate random vehicles approaching the intersection. To make this possible, we constructed a NewVehicle function in which we create a vehicle and then used Poisson distribution function to randomly re-execute the NewVehicle function. By doing this, we simulate the arrival of the first vehicle and the let Poisson distribution function determine when the next vehicle should arrive. The reason we used Poisson distribution is it would allow us to generate a discrete integer by specifying a desired mean value. The Poisson Mass Distribution Function (PMF) is as follows:

$$P(of \ k \ events \ happening) = \frac{\lambda^k e^{-\lambda}}{k!}$$
 (11)

where:

 $\lambda = average number of events$ 

e = Euler's number 2.71828

k = an integer starting at zero

 $k! = the \ factorial \ of \ K$ 

Therefore, configuring an arrival rate with a mean of 8 would result in 7.5 vehicles arriving per minute per direction totaling 30 in all directions. It is important to highlight that the mean value does not specify the vehicle arrival rate but rather when the NewVehicle function is called for the next vehicle to arrive. Table 4.1 goes over the mean parameter used for each of the traffic condition used in this study.

Traffic Conditions	Poisson Mean	Intersection Vehicle Rate of Arrival		
Light	8 30 vehicles/minute			
Moderate	7	34.28 vehicles/minute		
Heavy	6	40 vehicles/minute		

Table 4.1: Definition of Traffic Conditions

Once the vehicle arrived, we then needed to come up with the additional parameters that would normally be provided by the vehicle approaching the intersection.

Table 4.1 goes over these parameters and the possible values that each could take.

Parameter	Possible Values
Vehicle ID	Auto increasing integer number that starts at 0 and
	increases by one.
Distance	This is the distance at where the vehicle starts
	communicating with the intersection hub. Based on our
	code, this could be set to any value.
From	The program is set to assign a vehicle from each
	direction (East, South, West, and North) each second.
То	Randomly selected code where the vehicle is headed to
	(Straight, Right, Left) based on the specified parameters.
Speed Lower Bound	Specify the lower bound that can be randomly selected
	for vehicle speed.
Speed Upper Bound	Specify the upper bound that can be randomly selected
	for vehicle speed.
Lane	Identify where the vehicle is located based on the To
	direction mentioned above,
Type	Randomly select the type of vehicle (Sedan or Bus)
	based on the parameter specified

Table 4.2: List of Vehicle Parameters Available

In addition to the parameters above, our code also offers the option to change a set of global parameters. Table 4.3, goes over the global parameters:

Parameter	Possible Values		
Time	Specify the simulation time in seconds		
Mean	Specifies the mean separation between vehicles arriving		
	at a single side of the intersection.		
Lazy Switch	Specify if the Lazy Algorithm is enabled (1=ON)		
Vehicle Queue Timer	(Available only on Lazy Algorithm) Specify the amount of time a vehicle has to wait before being issues a green		
	light.		

EW Queue Size	(Available only on Lazy Algorithm) Specify the amount of vehicles that need to be in the East/West queue before being issued a green light.
NS Queue Size	(Available only on Lazy Algorithm) Specify the amount of vehicles that need to be in the North/South queue before being issued a green light.
Cycle Time	Total light cycle time in seconds. (Available only on the Pre-Time Algorithm)
<b>Left Turn Time Duration</b>	Green light time allocated to left turns in seconds. (Available only on the Pre-Time Algorithm)
Straight/Right Time Duration	Green light time allocated to straight/right in seconds.  (Available only on the Pre-Time Algorithm)

Table 4.3: Program Global Parameters

It is important to highlight that vehicles arriving from a lane that already had a vehicle waiting to cross would be forced to match the speed of the vehicle in front.

Adjusting the speed would prevent a vehicle pileup at the intersection. Figure 4.1 illustrates an instance of when vehicle speed would need to be matched by the vehicle in front. The actual mechanism to adjust the vehicle speed was not explored in this paper.

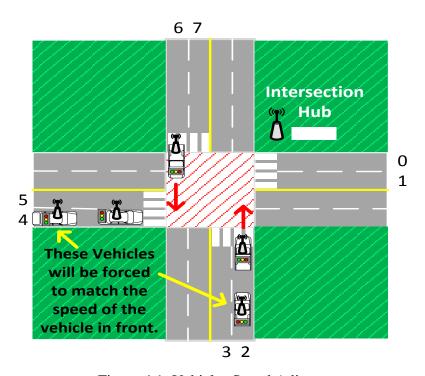


Figure 4.1: Vehicles Speed Adjustments

After all the vehicle parameters have been identified, the code then adds the vehicle to a first-in-first-out (FIFO) queue (Linked List) in which it keeps track of the order each vehicle arrived.

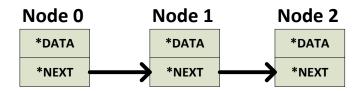


Figure 4.2: Linked List Used as Queue

As seen in figure 4.2, Node 0 would contain the information regarding the first vehicle that arrives at the intersection. The \*Next pointer for Node 0 would hold the address of the next vehicle pointer. By taking this approach, we avoid running out of memory as we keep adding vehicles to the simulations.

## 4.2 Vehicle Scheduling

The second major component of our simulation code involved the actual scheduling of the vehicles. This involves determining when the vehicle is scheduled to make use of the intersection critical zone. To do so, our code first finds the last time slot taken by a vehicle located in the same lane as the new vehicle. If the intersection hub determines that the new vehicle will arrive at the intersection critical zone before the last vehicle, it automatically blocked a second at the back and append the new vehicle. The one-second separation was added as a precautionary measure. On the other hand, if the intersection hub determines that the new vehicle will arrive after the last vehicle, it simply adds the new vehicle to the back of the queue. After the new vehicle is placed in the appropriate time slot, the time slots for conflicting lanes are also blocked.

During this stage, we also assign what we call the time-to-pass (T2P) parameter. As previously mentioned, the T2P is the time, in seconds, it takes a vehicle to cross the intersection critical zone. The T2P times become particularly important when two vehicles with conflicting trajectories are needing to make use of the critical zone. As see in figure 4.2 below.

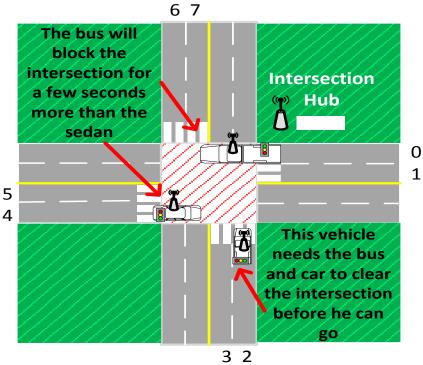


Figure 4.3: Illustration of Time-to-Pass (T2P) based on Vehicle Type

## 4.3 Vehicle Dispatch

In the final stage of our simulation code, we simply process the vehicles in the order they got put into the time slot array and queue. The time slot array specifies the exact time when a vehicle should be allowed to use the intersection critical zone. The queue simply keeps track of the order but not the time. A combination of arrays and queues were used as a precautionary measure to ensure vehicles got processed in the correct order.

Therefore, in our simulation code, we check to make sure that the vehicle specified in the

time slot array matches what is next on the queue. Once the vehicle is released to cross the intersection critical zone, the code starts collecting as much statistical information as possible to find the average waiting time, longest waiting time, and percent of stopping vehicles among others. A copy of the code is provided in appendix A and a brief overview of the functions and their order of execution are illustrated in figure 4.3.

```
CarArrive (dir, sec)

-CarNew (dir, to) [Added to queue]

-IdentofyLane (dir, to)

-SchedCross (newptr, sec) [Added to time slot array]

-t2p (schedT, type, to, eta)

-CarPrint (newptr, sec)

HandleCross (dir, sec)

CarPass (carptr, dir)
```

Figure 4.4: Simulation Code Execution Order

## Chapter 5 Simulation Scenarios

To effectively evaluate the performance of our Lazy Algorithm, we decided to compare it with the standard Pre-Time Algorithm and the FIFO Algorithm proposed by [11]. The performance of each algorithm was evaluated in terms of average waiting time, intersection throughput and percent of stopping vehicles under light, moderate and heavy traffic conditions.

Furthermore, we wanted to compare the performance of both the FIFO and Lazy
Algorithm through a second 4-way DVTL equipped intersection. The average waiting
time for each intersection would then be recorded to see if a second intersection improves
of worsens the overall traffic flow. It is important to highlight that our focus was placed

on a single direction, meaning that we studied the average waiting time for vehicles exiting the first intersection from the west and entering the second intersection from the east.

#### 5.1 Parameter Selection

Before testing each algorithm, we first needed to determine parameters such as T2P and vehicle arrival rate among others. The values obtained are intended for simulation purposes and therefore can be adjusted as needed.

As previously mentioned, the T2P values were determined by conducting a time study at an intersection located in Albuquerque, NM. Table 5.1 are the results we obtained and the values we decided to use in all of our scenarios.

Time to Pass(T2P)					
	Sed	ans	Buses		
	Motion	Rest	Motion	Rest	
Left	3 sec	4 sec	4 sec	5 sec	
Straight	2 sec	3 sec	3 sec	4 sec	
Right	1 sec	2 sec	2 sec	3 sec	

Table 5.1: T2P Times used in Simulation

As seen in table 5.1, sedans and buses have different T2P based on where they are going and if they are at rest.

To effectively identify the light, moderate, and heavy traffic conditions, we first needed to identify the intersection average occupancy, where the vehicle occupancy is defined as the number of vehicles that could simultaneously make use of the intersection critical zone. To evaluate our intersection, we came up with the maximum and minimum intersection critical zone occupancy.

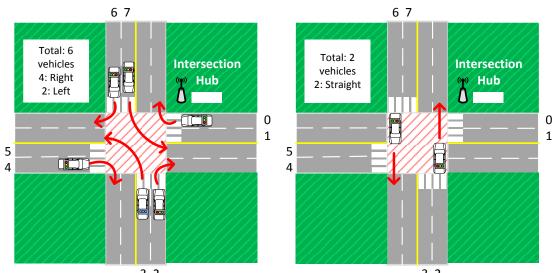


Figure 5.1: Max Intersection Occupancy

Figure 5.2: Min Intersection Occupancy

For each of these two cases, we then considered the case where all vehicles could be buses or sedans. We then used both the shortest and the longest T2P to come up with an average occupancy rate. Tables 5.2, 5.3, and equations 12, 13, and 14 go over our calculations.

	Maximum Intersection Occupancy				
6 Vehicles 2 Left 4 Right		Buses at Rest	(2 * 5) + (4 * 3) = 32 seconds		
		Buses in Motion	(2*4) + (4*2) = 16 seconds		
	2 Left	Sedans at Rest	(2 * 4) + (4 * 2) = 16 seconds		
4 Right		Sedans in Motion	(2 * 3) + (4 * 1) = 10 seconds		
			Total: 74 seconds		

Table 5.2: Max Intersection Occupancy Calculation

Minimum Intersection Occupancy					
2 Vehicles	2 Straight	Buses at Rest	2 * 4 = 8 seconds		
		Buses in Motion	2 * 3 = 6 seconds		
	2 Straight	Sedans at Rest	2 * 3 = 6 seconds		
		Sedans in Motion	2 * 2 = 4 seconds		
	Total: 24 seconds				

Table 5.3: Min Intersection Occupancy Calculation

$$\frac{6vehicles}{74 sec} + \frac{2 vehicles}{24 sec} = .164v/s (12)$$

$$.164v/s * 60sec = 9v/min/direction (13)$$

9v/min/direction \* 4 direction = 36 vehicle /minute (14)

Based on these results, we decided to use a mean of 7 in our Poison equation for the moderate traffic conditions which produced an arrival rate of 34 vehicles per minute. Table 5.4 identifies the vehicle arrival rate that was used for each of the three conditions we wanted to test for.

	Heavy	Moderate	Light
	Traffic	Traffic	Traffic
Vehicles/Min	40	34	30

Table 5.4: Traffic Condition Definition

The rest of the global parameters used for all these scenarios are listed in table 5.5.

Parameter	Value	Parameter	Value
Time	1800s	% Going Right	20%
Mean	6,7,8	% Going Left	20%
<b>Speed Lower Bound</b>	25 mph	% Going Straight	60%
Speed Upper Bound	35 mph	% Sedans	80%
Distance	300 meters	% Buses	20%

Table 5.5: Global Parameter Values used in Simulation

## 5.2 Pre-Time Algorithm Scenario

The Pre-Time Algorithm refers to the most basic algorithm of processing vehicles across an intersection where a set time of green is pre-programmed into the intersection controller. In this thesis, we ran four simulations to find the cycle time that could yield the best performance. Table 5.6 goes over the multiple parameters that were utilized.

	Simulation A	Simulation B	Simulation C
Cycle Time	200 sec	100 sec	50 sec
Left Turn Time (per direction)	20% of cycle	20% of cycle	20% of cycle
Straight Right Time (per direction)	80% of cycle	80% of cycle	80% of cycle

Table 5.6: Pre-Time Cycle Time Scenario Parameters

To gain a better understanding of how the above cycle times are utilized, the pseudo code for the Pre-Time Algorithm is explained in figure 5.3.

#### Pre-Time Variable

#### Let:

T<sub>EW-Left</sub> = Green time for vehicle arriving from east/west and headed left

T<sub>EW-Straight</sub> = Green time for vehicle arriving from east/west and headed straight

T<sub>NS-Left</sub> = Green time for vehicle arriving from north/south and headed left

T<sub>NS-Straight</sub> = Green time for vehicle arriving from north/south and headed straight

 $Q_L[dir] = Vehicles in the left queue for each direction (E=0,S=1,W=2,N=3)$ 

 $Q_{SR}[dir] = Vehicles in the straight/right queue for each direction (E=0,S=1,W=2,N=3)$ 

 $G_{\text{start}}$  = Time when green light starts in seconds

 $G_{end}$  = Time when green light ends in seconds

#### Pre-Time Algorithm

 $\overline{\mathbf{If}} G_{\text{start}} >= T_{\text{EW-Left}} <= G_{\text{end}}$ 

Schedule the vehicles turning left and arriving from east and west Continue

If  $G_{\text{start}} >= T_{\text{EW-Straight}} <= G_{\text{end}}$ 

**Schedule** the vehicles **going straight or right** and arriving from **east** and **west Continue** 

If  $G_{\text{start}} >= T_{\text{NS-Left}} <= G_{\text{end}}$ 

**Schedule** the vehicles **turning left** and arriving from **north** and **south Continue** 

If  $G_{\text{start}} >= T_{\text{NS-Straight}} <= G_{\text{end}}$ 

**Schedule** the vehicles **going straight or right** and arriving from **north** and **south Continue** 

Figure 5.3: Pre-Time Algorithm Pseudo Code

### 5.3 FIFO Algorithm Scenario

The FIFO Algorithm was developed by the University of New Mexico in collaboration with Shanghai Jiaotong University in China. This algorithm is the baseline structure for the algorithm developed in this thesis. However, as previously mentioned, the performance of this algorithm worsens in comparison to the Pre-Time Algorithm under heavy traffic conditions. Additionally, their algorithm does not take into consideration the different types of vehicles and the time it requires the vehicle to pass the critical zone. Most importantly, it does not take advantage of creating platoons to reduce the T2P of each vehicle. The simulation was once again executed using this algorithm for a total of 1800 seconds and the pseudo code is as follows:

#### FIFO Variables

Let:

 $V_{A}$  = Vehicle arrival array

 $V_F$  = Direction from where the vehicle arrives to the intersection

 $V_{T}$  Direction where vehicle is headed to after crossing the intersection

#### FIFO Algorithm

If V<sub>A</sub> is not empty

**Do** the following for each  $V_F$ 

**If** V<sub>T</sub> left:

**Schedule** the vehicle to cross the intersection **Then** block all interfering lanes for that time slot **Continue** 

If V<sub>T</sub> right:

**Schedule** the vehicle to cross the intersection **Then** block all interfering lanes for that time slot

#### Continue

If V<sub>T</sub> straight:

**Schedule** the vehicle to cross the intersection **Then** block all interfering lanes for that time slot **Continue** 

If V<sub>A</sub> is empty

Generate a new vehicle

**Dispatch** Vehicle according to the scheduling array

Figure 5.4: FIFO Algorithm Pseudo Code

## 5.4 Lazy Algorithm Scenario

As previously stated, the Lazy Algorithm has two important parameters that can significantly impact its performance. These parameters are the queue release time delay and vehicle queue quorum count. The queue release time specifies the amount of time (in seconds) the intersection hub should wait before releasing a queue of vehicles headed in a straight or right direction onto the intersection critical zone. Similarly, the vehicle queue quorum count is the number of vehicles that need to be present in the queue before being allowed to use the critical zone. The Lazy Algorithm requires that one of these two parameters be met before releasing the queue onto the intersection critical zone.

To test this algorithm, we decided to run a total of 5 simulations in which we used multiple parameter combinations to find the best solutions. Table 5.7 illustrates the different combinations of parameters that were used.

		Case A	Case B	Case C	Case D	Case E
Light	QCount	20 vehicles	20 vehicles	20 vehicles	40 vehicles	10 vehicles
	Time Delay	2 sec	4 sec	1 sec	2 sec	2 sec
Moderate	QCount	20 vehicles	20 vehicles	20 vehicles	40 vehicles	10 vehicles
	Time Delay	10 sec	20 sec	5 sec	10 sec	10 sec

Heavy	QCount	30 vehicles	30 vehicles	30 vehicles	60 vehicles	15 vehicles
-	Time Delay	15 sec	30 sec	7 sec	15 sec	15 sec

Table 5.7: Lazy Algorithm Scenario Parameters

In the next chapter, we will go over the results obtained after running the multiple simulations.

### 5.5 Two Consecutive 4-way Intersection Scenario

In this scenario, we ran a set of vehicles through two VDTL intersections. To accomplish this, we first ran one simulation in which we collected vehicles headed east. The set of vehicles collected in the first simulation was then used as input to the western direction of the second simulation. As indicated in Figure 5.5, vehicles at the first intersection (simulation) were all randomly generated. At the second intersection (simulation), vehicles coming from the North, East, and South were randomly generated while those in the west were coming from the first intersection. For consistency reasons, the vehicle arrival rate and simulation duration were set to the same at both intersections. Again, simulations were conducted for heavy, moderate, and light traffic conditions.

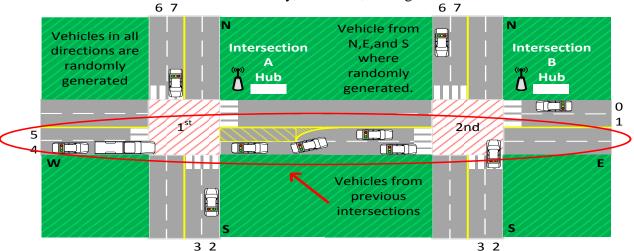


Figure 5.5: Algorithms through two Consecutive Intersections

## Chapter 6 Performance Study

In comparing the three algorithms, we were specifically interested in obtaining the vehicle average waiting time, intersection throughput and percentage of vehicles that stopped.

To compare the three algorithms, we decided to run multiple simulations in which we used a variety of parameter settings. For each parameter combination (case), the simulation was executed a total of 5 times for a duration of 1800 seconds. The results obtained from each set of simulations were then averaged to obtain a better understanding of the long-term impacts of such algorithms under light, moderate, and heavy traffic conditions.

Table 6.1 goes over the results obtained from running four simulations for the Pre-Time Algorithm. We tested with cycle times starting at 200 seconds and went down by 50% decrements. The last simulation was conducted under a cycle time of 50 seconds which would allow a left turn to happen in a 5-second window. Therefore, we felt that testing for cycle times lower than 50 seconds would be unrealistic. The values highlighted in yellow represent the set of parameters we utilized in the comparison since they produced the best performance. In the Pre-Time case, it turned out that using the same parameter settings resulted in the best performance for all traffic pattern.

	Case A	Case B	Case C			
Cycle Time	200	100	50			
Left Turns	20 sec	10 sec	5 sec			
Straight Right	80 sec	40 sec	20 sec			
Light Traffic Simulations at 30 vehicles/min						
AWT (sec)	61.91	<mark>37.87</mark>	41.91			

Throughput	94.17	<mark>95.87</mark>	94.91					
% Stopped	83.52	<mark>85.51</mark>	87.33					
Moderate Traffic Simulations at 34 vehicles/min								
AWT (sec)	60.5	<mark>45.36</mark>	50.33					
Throughput	94.23	<mark>95.44</mark>	93.06					
% Stopped	84.43	<mark>86.34</mark>	88.50					
Heavy Traffic Simulations at 40 vehicles/min								
AWT (sec)	66.33	<mark>52.33</mark>	51.63					
Throughput	94.03	94.32	92.25					
% Stopped	87.33	<mark>88.85</mark>	90.63					

Table 6.1: Pre-Time Algorithm Performance Study Results

In running multiple simulations with a different set of parameters, we came to the determination that using a total cycle time of 100sec for all light, moderate and heavy traffic conditions would yield the lowest AWT and best throughput. We considered the results for cycle 100 and 50 at heavy traffic conditions to be the same. The column highlighted in yellow represent the values we utilized in our comparison.

In a similar manner, multiple simulations were performed to obtain the average valued for the FIFO Algorithm. However, because the FIFO Algorithm did not require any parameters, statistics for a single case were obtained. Table 6.2. goes over the values that we used in comparing the FIFO Algorithm to the other algorithms.

FIFO Algorithm Performance Study Results						
Light Traffic Simulations at 30 vehicles/min						
AWT (sec)	5.31					
Throughput	98.30					
% Stopped	64.79					
Moderate Traffic Simulations at 34 vehicles/min						
AWT (sec)	AWT (sec) 55.33					
Throughput 93.92						
% Stopped	95.92					
Heavy Traffic Simulations at 40 vehicles/min						
AWT (sec) 147.26						
Throughput 81.46						
% Stopped 99.02						

Table 6.2: FIFO Algorithm Performance Study Results

Lastly, simulation results for the Lazy Algorithm were obtained by executing 5 simulations for each case in which we created a base parameter set and then varied both the vehicle queue count and time delay to determine the best combination. As seen in Figures 6.3,6.4, and 6.5 the yellow columns represent the set of values where the algorithm performed its best. Therefore, the corresponding parameters to those values were used to compare the Lazy Algorithm to both the Pre-Time and FIFO Algorithms. As with the Pre-Time Algorithm, we ran into instances where more than one set of parameters presented an improvement over both the Pre-Time and FIFO Algorithms.

Lazy Algorithm Light Traffic Performance Study Results 30 vehicles/min								
Base Case Case A Case B Case C Case D								
		2x Time	½ Time Delay	2x Queue	½ Queue			
	Delay Count Count							
Queue Count	20 vehicles	20 vehicles	20 vehicles	40 vehicles	10 vehicles			
Time Delay	2 sec	4 sec	1 sec	2 sec	2 sec			
AWT (sec) 5.96 7.34 5.96 6.81 6.24								
Throughput (%)	98.00	98.05	98.00	97.91	98.35			
% Stopped	<mark>63.24</mark>	83.42	63.24	66.61	68.24			

Table 6.3: Lazy Algorithm Light Traffic Performance Study

Lazy Algorithm Moderate Traffic Performance Study Results 34 vehicles/min								
	Base Case Case A Case B Case C Case D							
		2x Time Delay	½ Time Delay	2x Queue Count	½ Queue Count			
Queue Count	20 vehicles	20 vehicles	20 vehicles	40 vehicles	10 vehicles			
Time Delay	10 sec	20 sec	5 sec	10 sec	10 sec			
AWT (sec)	10.79	13.93	48.18	11.59	11.38			
Throughput (%)	97.67	97.84	94.63	97.92	97.82			
% Stopped	<mark>94.96</mark>	94.95	97.88	95.00	95.65			

Table 6.4: Lazy Algorithm Moderate Traffic Performance Study

Lazy Algorithm Heavy Traffic Performance Study Results 40 vehicles/min							
	Base Case	Case A	Case B	Case C	Case D		
		2x Time	½ Time Delay	2x Queue	½ Queue		
		Delay		Count	Count		

Queue Count	30 vehicles	30 vehicles	30 vehicles	60 vehicles	15 vehicles
Time Delay	15 sec	30 sec	7 sec	15 sec	15 sec
AWT (sec)	15.82	20.95	82.84	18.69	17.77
Throughput (%)	<mark>97.84</mark>	97.16	89.21	97.71	97.28
% Stopped	<mark>97.96</mark>	95.99	98.95	98.40	98.27

Table 6.5: Lazy Algorithm Heavy Traffic Performance Study

In the following section, we combine the set of values for each algorithm that produced the best results and compare them.

## 6.1 Average Waiting Time

The first parameter used to evaluate the performance of the three algorithms was the average waiting time (AWT). In this paper, the AWT is defined as the total wait time divided by the number of vehicles that passed the intersection. In running the simulations at different vehicle arrival rates, we noticed that the Lazy Algorithm outperformed both the Pre-Time and FIFO Algorithm. Figure 6.1 goes over the results obtained.

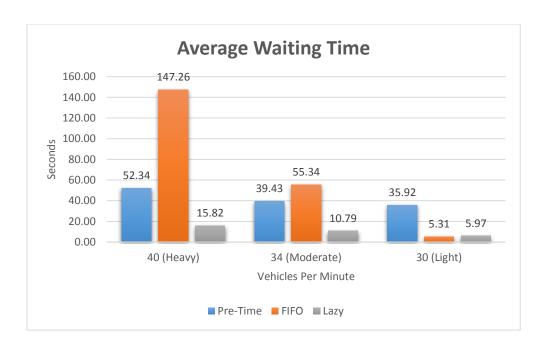


Figure 6.1: Average Waiting Time Comparison

In analyzing the result for the AWT, we noticed an overall reduction in the AWT when intersections are equipped with a VDTL systems that use the Lazy Algorithm. As seen in figure 6.6, the Lazy Algorithm proved to reduce the AWT under all traffic conditions. While the Pre-Time Algorithms maintains a somewhat constant AWT, the FIFO Algorithm worsens as the rate of vehicles approaching the intersection increases. On the other hand, the Lazy Algorithm maintains a low AWT under all traffic conditions by taking advantage of the platooning mechanism and adjusting its parameters based on traffic conditions. Recall that the Lazy Algorithm is capable of creating platoons that result in a lower T2P for all vehicles encapsulated within the same platoon. Figure 6.2, 6.3, and 6.4 present a histogram under heavy traffic conditions of one of the many simulations in which we can see how each of the algorithms is capable of creating platoons.

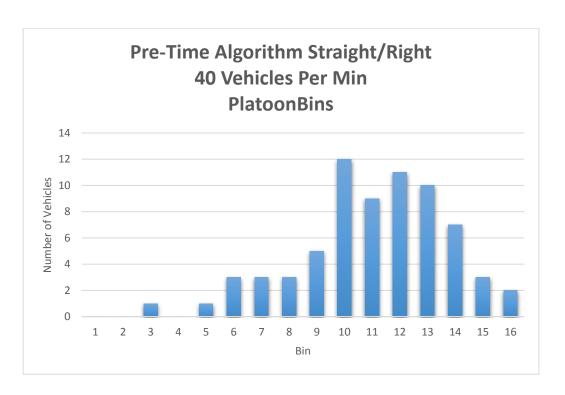


Figure 6.2: Pre-Time Algorithm Straight/Right Platoon Bins

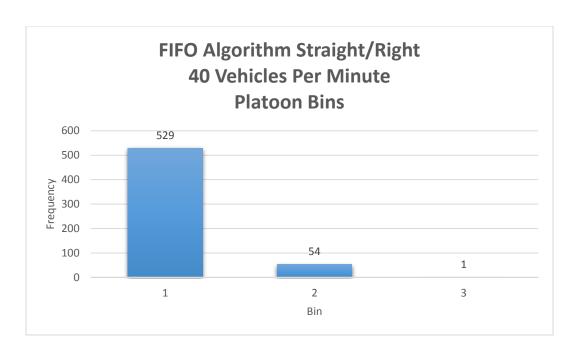


Figure 6.3: FIFO Algorithm Straight/Right Platoon Bins

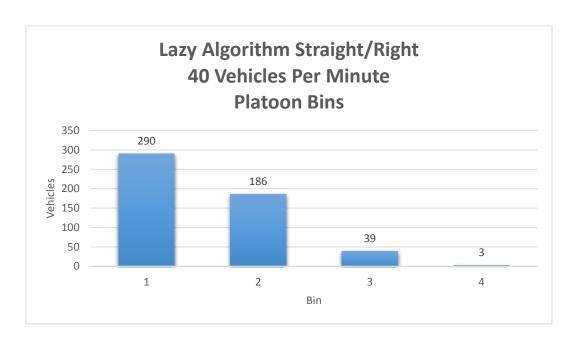


Figure 6.4: Lazy Algorithm Straight/Right Platoon Bins

The average platoon size for each of the algorithms is illustrated in figure 6.5.

And while the platoon size for Lazy Algorithm is only slightly higher as previously seen, it does have an impact.

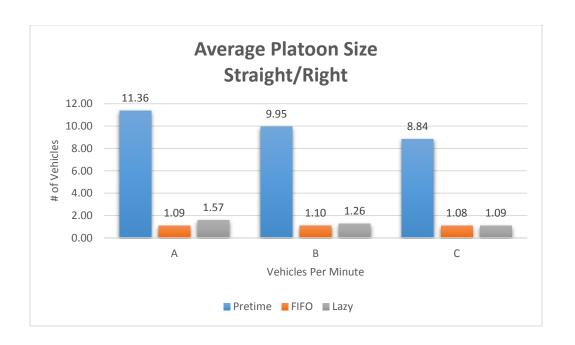


Figure 6.5 Average Platoon Size

In reviewing these graphs, we can see how the Pre-Time Algorithm platoons are way too big which leads to an increase in AWT. On the other hand, the FIFO Algorithm has a hard time creating platoons and it barely makes 59 platoons of two. However, the Lazy Algorithm is capable of creating substantial amount of platoons with 2 or more vehicles. In a sense, the Lazy Algorithm performed well under heavy and light traffic conditions by dynamically scheduling vehicles in a way that imitates the both Pre-Time(heavy) and FIFO (light) Algorithms.

## 6.2 Intersection Throughput

The intersection throughput was another important parameter we decided to use to compare all three algorithms. As illustrated in figure 6.6, the Lazy Algorithm was able to increase the intersection throughput under heavy and moderate traffic conditions in comparison to both Pre-Time and FIFO Algorithms. Under light traffic conditions, the

Lazy Algorithms came out slightly lower than the FIFO Algorithm but still better than the Pre-Time.

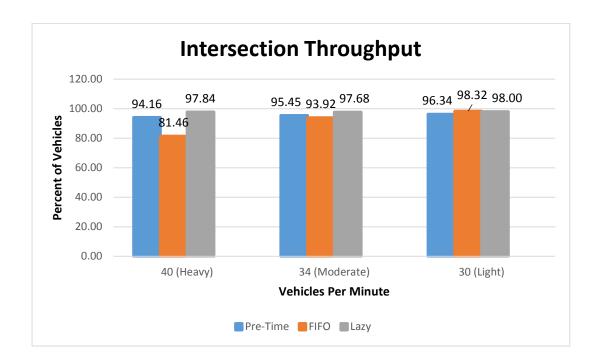


Figure 6.6: Intersection Throughput

As expected, the Lazy Algorithm increases the intersection throughput during heavy and moderate traffic conditions. These results confirm our initial theory that allowing vehicles to cross the intersection in platoons would be advantageous. However, as the traffic conditions improve and the number of vehicles arriving at the intersection decreases, the Lazy Algorithm becomes a bit less effective. Nonetheless, the intersection throughput at light traffic conditions is still an improvement over Pre-Time and about the same as the FIFO Algorithm. In the case of light traffic, we suggest configuring the Lazy Algorithm to behave similarly to the FIFO Algorithm.

### 6.3 Percent of Vehicles that Stopped

Our third evaluating parameter was the percent of vehicles that were forced to stop at the intersections for a least 1 second. This parameter would allow us to see which algorithms could potentially become a 4-way stop during heavy traffic conditions.

Figure 6.7 clearly illustrates how the Lazy Algorithm slightly reduces the amount of vehicles that have to stop under heavy traffic conditions.

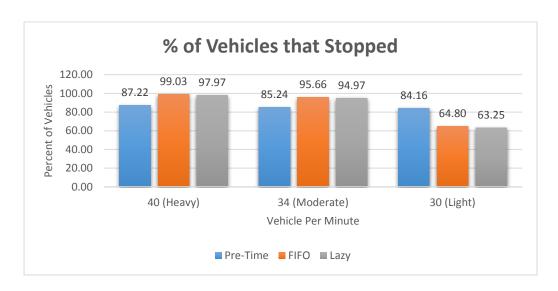


Figure 6.7: Percent of Vehicles that Stopped at the Intersection

At first glance, one might conclude that the Lazy Algorithm had no significant reduction in the percentage of vehicles that were required to stop. However, we need to consider the fact that the Lazy Algorithm forces vehicles in the straight and right direction to wait for a small amount of time until a second or third vehicle arrives. The Lazy Algorithm does this in order to create platoons that can take advantage of a lower T2P. In short, the Lazy Algorithm does what is best for each vehicle and the group (Platoon). Based on this, some vehicles are forced to stop in order to improve the AWT from all other vehicles.

## 6.4 Two Consecutive 4-way Intersection

In this last simulation, we were particularly interested in finding the AWT for vehicles traveling across two consecutive VDTLS intersections using the same processing algorithm. Figures 6.8 and 6.9 illustrate the results.

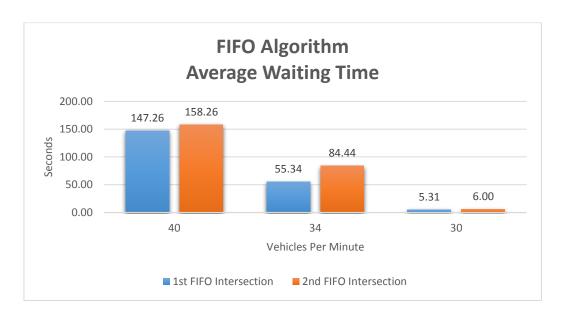


Figure 6.8: AWT for Consecutive 4-way Intersections using FIFO Algorithm

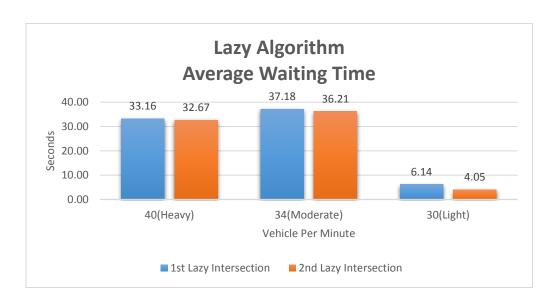


Figure 6.9: AWT for Consecutive 4-way Intersections using Lazy Algorithm

Based on the results obtained, we can conclude that vehicles crossing to VDTL intersection with FIFO Algorithm will experience an increase in the overall AWT. In comparison, vehicles traveling through two VDTL intersections using the Lazy Algorithm will experience a reduction in AWT under light, moderate and heavy traffic conditions.

## Chapter 7 Conclusion

In this thesis, we looked into the development of a Vehicle Dashboard Traffic Light Systems that leverages the power of VANET's to improve traffic flow at a 4-way intersection in an attempt to reduce fuel consumption and the amount of CO<sub>2</sub> gasses released into the environment. More specifically, we looked into addressing the deficiencies that other vehicle processing algorithms fail to overcome.

The heuristic Lazy Algorithms presented in this thesis focused on preventing the unnecessary vehicle stops that are experienced when utilizing a Pre-Time Algorithm.

Additionally, it took advantage of the platooning mechanism to avoid becoming a 4-way intersection under heavy traffic conditions like the FIFO Algorithm experiences.

To evaluate all three algorithms, scenarios were developed and a C based simulator was built to test. The performance of each algorithm was then evaluated based on vehicle average waiting time, the percentage of vehicles that passed the intersection, percentage of vehicles that were required to stop, and the maximum waiting time experienced by a vehicle.

The results obtained in our multiple simulations indicate that the Lazy Algorithm does in fact outperform both the Pre-Time and FIFO Algorithms. The Lazy Algorithm's

capability of releasing a vehicle headed into the straight/right direction onto the intersection critical zone based on vehicle quorum count or time delay has proven to be advantageous. However, after running a significant amount of simulations, we came to realize there is a fundamental tradeoff that must happen when configuring each of these algorithms. We found that one needs to find the right balance between minimizing the AWT and maximizing the number of vehicles that cross the intersection critical zone. As stated in the previous sections, making use of platoons can highly enhance the performance of the intersection during heavy and moderate traffic conditions if used with moderation. In other words, the size of the platoon should not be too big or too small.

## 7.1 Future Research Opportunities

Without a doubt, the topic of maximizing the traffic flow through a 4-way intersection will continue to be a topic of interest. And while this thesis attempts to bring us closer to a feasible solution, there is still plenty of work to be done.

To start with, making adaptations to the Lazy Algorithm so that vehicles can adjust their crossing schedule after their initial introduction to the intersection would be very advantageous. Vehicles could then be allowed to change lanes when possible without impacting the overall crossing schedule. Furthermore, a queue flush mechanism should be developed that would permit vehicles on a particular side to go green when an emergency vehicle is approaching. Lastly, the creation of some sort of failsafe that can prevent a pileup in the event that a vehicle breaks somewhere within the intersection perimeter.

# Appendix A

Code repository: https://github.com/alejflor/VDTL.git

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