

## Research Article

# An Emulation Mechanism for PLC Communication Features

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## ABSTRACT

In recent years, internet has widely used in different fields. To identify a specific device, we usually use the information which attains from network packets such as Internet Protocol (IP) address, Media Access Control (MAC) address and communication port, etc. However, using this kind of information is not enough to identify precisely. Furthermore, most of this kind of information could be imitated easily. Therefore, our research focuses on behavior of communication devices that can identify the devices precisely and create a communication system which is able to imitate the behavior of some specific devices.

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## 1. INTRODUCTION

With the growth of internet technology, there are more and more industrial systems connecting to the internet. This result in devices that can connect to the internet have an explosive increase. As a result, how to specify every device on the internet has become a big problem. Compare to the past, some information such as Internet Protocol (IP) address, Media Access Control (MAC) address, and communication port is commonly used to identify a specific device on the internet. However, using this kind of information is not enough to identify comprehensively because the information can simply be imitated by any other devices. This research focus on the features of communication devices and also provide a mechanism that can analyze these features and generate configuration references which other devices can simply apply. With the customized communication module and the references mentioned above, it can make other devices imitate the behavior of the analyzed device and provide a better effect on device emulation. With the emulation of devices features, it can make the emulation devices close to the specific devices. This communication system might be useful in some special domain such as industrial communication system that need an emulator which can induce hackers to attack the industrial control system.

## 2. BACKGROUND

This section discusses some research and methods which are commonly applied to perform device identification. This section would

involve the general method that mostly used on every internet device in the world and some novel methods that are proposed by other researchers using different kind of emerging technologies.

### 2.1. Packet Header

When devices communicate with each other, they must use the same protocol. Thus, allow them to understand what the other side transmit. Nowadays, the generally used protocol is the TCP/IP protocol suite. This protocol suite includes a great deal of widely used protocols. Some well-known protocols in the TCP/IP suite are IP, Transmission Control Protocol (TCP), User Datagram Protocol (UDP), etc., which are performed in different layers. These protocols have their own specific packet header when they are used.

The information in these headers or the combination of different information in different header can be used to identify the source of the internet packet. In the next few paragraphs, this paper will explain the detail of how information in headers is used for device identification.

#### 2.1.1. IP header

IP is the principal protocol in network communication. In the IP header, the major fields are source address and destination address and both exist in IPv4 and IPv6 header. Though the length of the address in IPv4 and IPv6 are different, the main function of these headers is the same. It can identify which device sends out this packet and which device should this packet send to. The two pieces of information could simply identify a specific device, but it is not

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enough for precise identification. Some networks may use network address translation and many devices would share a public IP address. In this situation, using an IP address as the only identifier is not enough for device identification.

### 2.1.2. TCP header

TCP often uses on reliable transmissions such as a webpage, video stream, and file transfer, etc. In the TCP header, there are two fields that can be used for device identification. These two fields are the source port and destination field. However, they cannot be used independently. They need to combine with IP address mentioned in the previous paragraph and carry out a better performance for device identification.

### 2.1.3. Ethernet frame

Ethernet protocol is a protocol that belongs to the data link layer. Recently, it is the principal protocol in general internet environment. Each Ethernet packet has an Ethernet frame that contains a header. An Ethernet header has four major fields: destination MAC addresses, source MAC addresses, Ethertype and IEEE 802.1Q tag or IEEE 802.1ad tag.

## 2.2. Traffic Patterns

Various devices will generate different traffic patterns depending on their needs. Some researches use traffic patterns to identify the devices. Research from Hiroki KAWAI has shown that they can analyze traffic patterns and identify devices in different categories [1]. Also, there are some researchers using machine learning to identify IoT devices which can classify all devices that connect to the network into some specific types [2–4].

## 3. FEATURES OF DEVICES

Each device has its special features when they are communicating. This research focus on the behavior of devices when they transmit packets. In our previous research, we find that the latency of the response packet between each device is unique. This discrepancy can be caused by various factors in different layers.

### 3.1. Physical Layer

The devices produced by the same factory with different models will have their unique features due to the variation of assembly lines. Regardless of the same model, they still exist unique features because of the standard error which is allowed by its supplier. Even more, the manufacturing tolerance that set by the manufacturer will also increase the diversity of features in devices.

### 3.2. Transport Layer

When devices transmit on the internet, they need to determine the protocol that is used in transport layer. Different protocols will

result in respective behavior and generate a distinctive feature of devices. For instance, when set up an OpenVPN environment, using UDP protocol might provide lower latency than using TCP protocol [5]. This shows that which protocol is used will impact the features of devices.

## 3.3. Application Layer

Every device has an operating system. Both the executive application and operating system on the device would affect the behavior. Moreover, the same function programmed in a different language would lead to various features. Different version of firmware may also increase the diversity of features. In conclusion, the application layer has many factors that will affect the behavior of the device.

## 4. EXPERIMENT AND RESULT

This research proposes a communication system that contain a mechanism of feature analysis which can generate data to perform devices emulation. The experiment uses a Schneider Programmable Logic Controller (PLC) to be an emulate device, using a Windows 10 PC responsible for analyzing other devices. Owing to the experiment device, the experiment will use a specific protocol which is commonly used in industrial control system called Modbus. Also, our communication system is programmed in C++ and run on Linux which can perform a better latency control of communication. Figure 1 is the overview of the system. This system can be separated into two parts. In Figures 2 and 3, it shows that the system has two major chains. The first chain is responsible for device analyzation and the second chain is responsible for emulation of the device.

### 4.1. Analysis Side

On the analysis side, it uses a computer to send the request of response, then send to the device being analyzed. When the

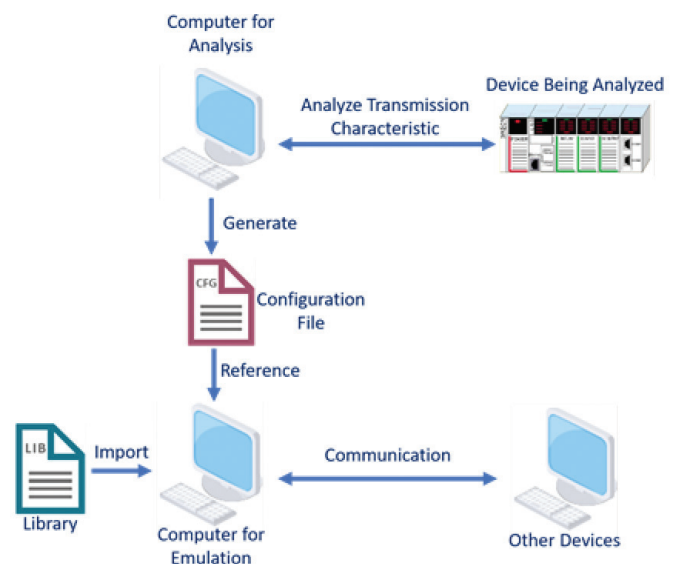
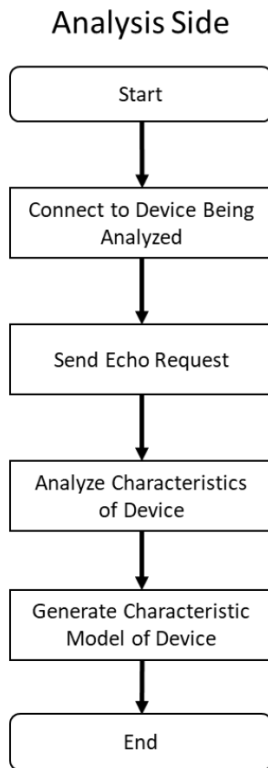
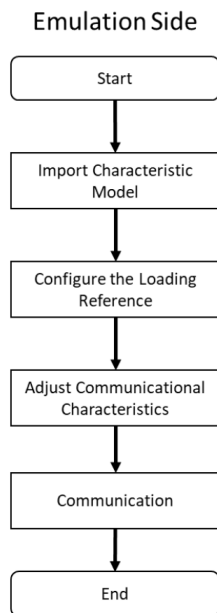


Figure 1 Overview of our specific communication system.



**Figure 2** | Flow chart of the analysis side of specific communication system.



**Figure 3** | Flow chart of the emulation side our specific communication system.

device being analyzed response to our computer, the computer then record its round-trip time. After the analysis, the analysis side sorts out these data into a feature model and arranges the data to a configuration file that can be used for the emulation side.

**Table 1** | The statistical table of experiment device

Device	Sample size	Average	Standard deviation
Schneider PLC	10,000	5.9258	0.378033
Emulator	10,000	5.9304	0.391371

**Table 2** | The Kolmogorov–Smirnov test result

	Absolute	0.006
Most extreme differences	Positive	0.001
	Negative	-0.006
	Kolmogorov–Smirnov Z	0.403
	Asymp. Sig. (two-tailed)	0.997

## 4.2. Emulation Side

On the emulation side, a device can either run our specific communication program or import our customize library. Both of them can load the feature model generated by the analysis side. Furthermore, the system adds a specific parameter called the loading parameter. Using the loading parameter, it can imitate the features of the device. Meanwhile, the device is at the working status.

## 4.3. Analysis Result

To analyze the result of our emulation, our result focuses on the latency of response messages. The result of analysis chooses Kolmogorov–Smirnov test for analyzation. [Table 1](#) is the statistical table of our experiment. The analysis computer sends 10,000 read register Modbus packet to both Schneider PLC and our emulator.

To explain how to evaluate the result, this paper will briefly explain the Kolmogorov–Smirnov test in the next paragraph. In Kolmogorov–Smirnov test, we assume that two samples come from the same distribution. In the result of the test, there is a field called asymptotic significance. In general, if asymptotic significance is greater than 0.05 or 0.1, it means that two samples come from the same distribution.

[Table 2](#) is the Kolmogorov–Smirnov test of our experiment. The asymptotic significance is 0.997 which is greater than 0.01. In other words, the emulation device can respond in the same features as the true Schneider PLC.

## 5. CONCLUSION

This paper proposes a mechanism to improve the emulation of device that focused on the difference of behavior on devices. This paper analyzes the response latency of device, then create a features model which can be applied to our specific commutation system. Our specific communication system can load the model file and provide a load parameter that can imitate the loading of device which is the behavior of device in working status. Also, according to the statistical table, this paper show that the system proposed can let normal computer imitate the same behavior as the working PLC.

## CONFLICTS OF INTEREST

The authors declare they have no conflicts of interest.

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## REFERENCES

- [1] H. Kawai, S. Ata, N. Nakamura, I. Oka, Identification of communication devices from analysis of traffic patterns, 2017 13th International Conference on Network and Service Management (CNSM), IEEE, Tokyo, Japan, 2017, pp. 1–5.
- [2] O. Salman, I.H. Elhadj, A. Chehab, A. Kayssi, A machine learning based framework for IoT device identification and abnormal traffic detection, *Trans. Emerging Tel. Technol.* (2019), e3743.
- [3] A.J. Pinheiro, J. de M. Bezerra, C.A.P. Burgardt, D.R. Campelo, Identifying IoT devices and events based on packet length from encrypted traffic, *Comput. Commun.* 144 (2019), 8–17.
- [4] Y. Meidan, M. Bohadana, A. Shabtai, J.D. Guarnizo, M. Ochoa, N.O. Tippenhauer, et al., *ProfilIoT: a machine learning approach for IoT device identification based on network traffic analysis*, Proceedings of the Symposium on Applied Computing, Association for Computing Machinery, NY, USA, 2017, pp. 506–509.
- [5] I. Coonjah, P.C. Catherine, K.M.S. Soyjaudah, Experimental performance comparison between TCP vs UDP tunnel using OpenVPN, 2015 International Conference on Computing, Communication and Security (ICCCS), IEEE, Pointe aux Piments, Mauritius, 2015, pp. 1–5.

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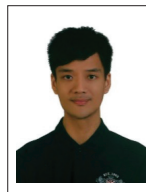
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