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An open virtual testbed for industrial control system security research

Bradley Galloway Reaves

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AN OPEN VIRTUAL TESTBED FOR INDUSTRIAL CONTROL SYSTEM
SECURITY RESEARCH

By

Bradley Galloway Reaves

A Thesis
Submitted to the Faculty of
Mississippi State University
in Partial Fulfillment of the Requirements
for the Degree of Master of Science
in Computer Engineering
in the Department of Electrical and Computer Engineering

Mississippi State, Mississippi

August 2011

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Bradley Galloway Reaves

2011

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SECURITY RESEARCH

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ICS security has been a topic of scrutiny and research for several years, and many security issues are well known. However, research efforts are impeded by a lack of an open virtual industrial control system testbed for security research. This thesis describes a virtual testbed framework using Python to create discrete testbed components (including virtual devices and process simulators). This testbed is designed such that the testbeds are interoperable with real ICS devices and that the virtual testbeds can provide comparable ICS network behavior to a laboratory testbed. Two testbeds based on laboratory testbeds have been developed and have been shown to be interoperable with real industrial control system equipment and vulnerable to attacks in the same manner as a real system. Additionally, these testbeds have been quantitatively shown to produce traffic close to laboratory systems (within 90% similarity on most metrics).

DEDICATION

To Sarah.

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LIST OF APPREVIATIONS

AES — Advanced Encryption Standard

ARP — Address Resolution Protocol

CAC — Bluetooth Channel Access Code

AES-CBC — AES Cipherblock Chaining Mode

CCA — Clear Channel Assessment

MS-CHAP — Microsoft Challenge Handshake Authentication Protocol

CRC — Cyclic Redundancy Check

CSV — Comma Separated Value file

AES-CTR — AES Counter Mode

DCS — Distributed Control System

DMZ — DeMilitarized Zone

DNP3 — Distributed Network Protocol 3

DNS — Domain Name System

EAP — Extensible Authentication Protocol

EAP-TTLS — Extensible Authentication Protocol Tunneled Transport Layer Security

ECDH — Elliptic Curve Diffie-Hellman

FHSS — Frequency Hopping Spread-Spectrum

FTP — File Transfer Protocol

GTK — Group Temporal Key

GUI — Graphical User Interface

HART — Highway Addressable Remote Transducer protocol

HMI — Human Machine Interface

HTTP — HyperText Transfer Protocol

ICS — Industrial Control System

IDS — Intrusion Detection System

IP — Internet Protocol

ISM — Industrial, Scientific, Medical RF Frequency Band

JSON — JavaScript Object Notation

LAN — Local Area Network

LAND — Local Area Network Denial attack

LEAP — Lightweight Extensible Authentication Protocol

MAC — Medium Access Control (network layer) or Message Authentication Code

MD5 — Message Digest 5 Hash Algorithm

MIC — Message Integrity Code

MITM — Man-in-the-Middle attack

MTU — Master Terminal Unit

NERC — North American Electric Reliability Corporation

PAC — Programmable Automation Controller

PAN — Personal Area Networks

PCAP — Packet Capture (file format)

PCS — Process Control System

PDC — Phasor Data Concentrator

PEAP — Protected Extensible Authentication Protocol

PID — Proportional-Integral-Derivative control scheme

PLC — Programmable Logic Controller

PMU — Phasor Measurement Unit

PSK — Pre-Shared Key (IEEE 802.11)

PTK — Pairwise Transient Key

RADIUS — Remote Authentication Dial-In User Service

RC4 — Rivest Cipher 4 stream cipher

RTDS — Real Time Digital Simulator

RTU — Remote Terminal Unit

SCADA — Supervisory Control And Data Acquisition

SIFS — Short Interframe Space (IEEE 802.11)

SKKE — Symmetric-Key Key Exchange

SPAN — Switched Port Analyzer

SSID — Service Set Identifier

SSP — Secure Simple Pairing

TCP — Transmission Control Protocol

TDMA — Time Domain Multiple Access

TKIP — Temporal Key Integrity Protocol

TTL — Time-to-Live (counter in IP headers)

UDP — User Datagram Protocol

USRP — Universal Software Radio Peripheral

VLAN — Virtual LAN

VPN — Virtual Private Network

WEP — Wired-Equivalent Privacy

WPA — WiFi Protected Access

WPA2 — WiFi Protected Access 2

CHAPTER 1

INTRODUCTION

1.1 Motivation

1.1.1 Problems in ICS Security

Industrial Control Systems (ICS), also known as Distributed Control Systems (DCS), Process Control Systems (PCS), and Supervisory Control and Data Acquisition (SCADA) systems are computer systems used to monitor control physical processes in manufacturing, chemical processing, electric generation, electric transmission and distribution, water/wastewater systems, and other industries. PCS collect data from remote facilities about the state of the physical process and send commands to control the physical process. Process control system communications are characterized by mainly machine-to-machine communications in point-to-point links and networks consisting of mainly computationally limited devices.

ICS security has been a topic of scrutiny and research for several years, and many security issues are well known[21, 22]. First, ICS often have poor security policies, including not enforcing strong, secret passwords for individual users. Second, human-machine interface software has been shown to have major flaws in user authentication [48]. Third, ICS communication protocols provide no mechanisms to guarantee integrity, authenticity,

or confidentiality of data, making injection or tampering of ICS communications possible (and in some cases, trivial). This is made worse by the fact that while historically ICS were directly connected using serial and fieldbus protocols, new advances in Ethernet and TCP/IP networking used in enterprise networks have become integrated into ICS networks. These advances allow previously separate ICS and enterprise networks to be bridged, allowing attackers of the enterprise network potential access to the ICS network as well.

Moreover, operators are reticent to patch ICS devices as patching requires downtime, and patches may break currently working systems; ICS, despite the reliability of the industrial hardware, are quite difficult to operate and maintain. As such, ICS operators are reticent to change anything in a working system. Some ICS devices use commercial off-the-shelf operating systems, including Microsoft Windows. These devices are vulnerable to attacks against these operating systems in the same way as PCs. Other systems use custom embedded or real-time operating systems; these proprietary systems are less tested for vulnerabilities by product developers, security researchers, and hackers, and may harbor many common programming and design errors like buffer overflows. For example, laboratory testing of ICS equipment has shown some devices to be vulnerable to common TCP SYN flood and LAND attacks; these vulnerabilities are no longer present in commodity operating system network stacks.

Much of the current research focuses on TCP/IP-based networks, and as such there is an emphasis on securing so-called “routable” protocols and ignoring “non-routable” protocols. Non-routable protocols are believed to be secure against any attacker without

physical access. The NERC Critical Infrastructure Protection [8] requirements show this philosophy in action. While it is, in fact, impractical to attack non-routable systems that use, for example, RS-232 connections without physical access, industrial wireless system use is becoming more and more prevalent in both routable and non-routable systems. These wireless systems introduce a number of vulnerabilities that can be exploited by attackers.

Additionally, these wireless systems sometimes make non-routable systems routable, and in all cases there is a greater risk of attack as attackers no longer need physical access to the systems to attack them because they can be attacked beyond logical boundaries (connection points). As an example of this, attackers may jam, eavesdrop, or inject packets between two wireless radios that are within a security perimeter, even in a secure building. This greatly complicates the concept of security perimeter, and even more challenges the assumption that non-routable systems are not in need of additional security practices. This is discussed further in Chapter 3.

1.1.2 Problems Faced by ICS Security Research

As discussed in the previous section, the development of security practices and techniques in the realm of process control systems has lagged the development seen in traditional information technology. However, researchers and industry practitioners have taken notice of the issue and are developing best practices, secure protocols[46, 32], and intrusion detection systems to meet the security needs of industrial control systems. Researchers have explored a number of different approaches to performing intrusion detec-

tion in process control systems, including signature-based, anomaly-based, model-based, state-based, and hybrid techniques. These will be discussed in further detail in the related work. However, research efforts are hampered by a number of issues.

First, industrial control systems are quite diverse in network size and topology, the number of standard communication protocols, communications media, as well as types of process to be controlled. Presently, researchers are only able to test their work in their own laboratory testbeds, which are necessarily limited in size and scope and not able to exhibit the diversity seen in real-world applications.

A second issue to ICS research follows from the first: it is difficult for researchers to develop generic solutions that can be used in many different process control systems because of their limited test systems. The solutions designed often only work given certain assumptions about the ICS system configuration, and reported results can only be provided in terms of the single system it was tested in.

Third, many of these testbeds are actually simulations developed in common network simulation toolkits like OmNet++ or NS2. These are purely simulated systems, and no work has been done to measure the similarity of the results of this traffic compared to actual ICS. Research results from these testbeds are dependent on fundamental assumptions made by the testbed designers, which may or may not hold true in practice. This limits the types of possible research approaches and the trustworthiness of the results.

The fourth issue is a grave problem for the scientific process: in some cases, solutions developed in one testbed are not easily distributed and tested in a different testbed for comparison. This means that, at present, it is difficult to quantitatively compare differ-

ent approaches directly to determine which approaches are more promising and effective. Currently, there is no “standard” test scenario for ICS security solutions.

1.1.3 Need for an open testbed for ICS security development

There are two approaches to creating a testbed: laboratory-scale ICS with real equipment and virtual testbeds. Some researchers use small, laboratory-scale processes controlled by ICS consisting of a few devices. Other researchers use virtual testbeds; these consist of simulated ICS devices, and may include a simulated process as well.

Laboratory scale systems have a number of advantages compared to virtual systems. First, the data will reflect realistic measurement variations that would be present in an actual process control system. Second, the communication patterns and latencies will be entirely accurate and not vulnerable to inaccuracies in simulated variables like OS scheduling load. Third, PCS devices are individually vulnerable to many attacks that may not affect all systems. These vulnerabilities may not be present in the specification of the system that the virtual testbed was designed to emulate; examples include protocol implementation bugs that cause the device to be vulnerable to Teardrop attacks, LAND attacks, web application attacks, or buffer overflows. Other security issues like poorly protected or hard-coded default passwords to devices will also not be present. With laboratory scale process control systems, captures of these attacks can be provided in addition to protocol-based attacks and normal background traffic.

In spite of their benefits, laboratory scale systems have a number of disadvantages. First, laboratory-scale systems are expensive to develop and can be difficult to maintain.

In particular, ICS software can be brittle and not user-friendly, and laboratory scale processes require maintenance to stay operational. Second, adding or changing features in a laboratory-scale system can be difficult. Third, the size of laboratory-scale systems is limited by the required space and funds, so by necessity the systems will be smaller and less featured than a real ICS.

Virtual systems, on the other hand, can be simpler to develop and have practically no maintenance costs. Doubling the size of a virtual system requires only development time, not a large purchase order. Furthermore, virtual system configurations can be backed up and recalled instantly, so changing or adding features to a virtual testbed after does not permanently alter the system. However, making changes or adding features to a virtual system is arguably easier than in a laboratory system. While the captures taken from either a laboratory or a virtual ICS may be distributed, a major advantage of a virtual system is that a virtual system can be distributed widely to many researchers. For example, researchers may use a virtual testbed provided by another group to place intrusion prevention systems in the testbed to test effectiveness; such distribution is impossible with laboratory testbeds. Being able to distribute the virtual testbed also means that any researcher can recreate traffic captures if necessary; such capture regeneration may be necessary if biases or problems are found with previously released datasets. This openness can help the testbed and datasets avoid obsolescence. Virtual testbeds are also more convenient to use than laboratory testbeds for developing and debugging ICS security projects because they are portable and require little set up for an experiment. While virtual testbeds provide a number of benefits, there are some disadvantages to their use. Certain attacks, especially

attacks that rely on device implementation errors, may not work against virtual testbeds. Also, virtual systems may not perfectly exhibit the same behavior as a real ICS system.

In spite of the advantages of a laboratory testbed, a virtual testbed that is open and freely available will solve the four problems described in the last section.

First, an open testbed will reduce duplication of effort as research groups do not have to all create their own testbeds; rather, if the open testbed does not fit a group's needs it may be improved in less time than creation of a new testbed. This results in a higher quality testbed for all researchers with less effort. Additionally, other researchers may contribute virtualized versions of their laboratory testbeds for all to use. By enabling the creation of more diverse testbeds, the first two problems of the previous section can be solved.

Second, an open testbed provides a common ground for research; even if researchers wish to use their existing testbeds, they can also test and distribute projects in the open testbed. The benefit of this is that research groups can share code, and published results can be duplicated and compared. This solves the fourth issue discussed in the previous section.

Third, this testbed may be used to generate captures of normal system network traffic and captures of attack or anomalous traffic for IDS researchers. These captures may be distributed with or independently of the testbed itself. This is a benefit to IDS researchers who prefer to work with captures instead of live testbeds. If the system is open, distributed captures may be recreated to correct for unexpected biases. This reduces the possibility of capture obsolescence.

Fourth, an open testbed opens the ICS security research area to more groups. Presently, ICS research requires substantial investment. With an open testbed, researchers can explore the area without having to purchase large laboratory setups. Additionally, amateur researchers and students can use the testbed without having to have the backing of a large organization.

Finally, while this thesis will later describe verification of the virtual testbed, an open testbed can be audited and verified by anyone. Because problems may be identified easier (according to the adage “Many eyes make bugs shallow”), and corrected by any inclined researcher, the third issue of the previous section is solved.

While the testbed can be used to address prior problems, additional features can extend its usefulness. First, interoperability of the virtual system with actual ICS equipment will allow for hybrid testbeds and extend the usefulness of the virtual testbed. Second, designing the testbed such that important characteristics like ICS protocols or communications interfaces can be changed will greatly enhance the ease of use of the system, especially compared with laboratory systems. Third, designing the testbed such that components can be replaced or extended easily will encourage use, reuse, and contribution to the testbed.

1.2 Contribution

In response to this problems discussed previously, this thesis forms the following hypothesis:

It possible to:

1. Create a virtual testbed framework using Python to create discrete testbed components

2. that is designed such that the testbeds are interoperable with real ICS devices and
3. that virtual testbeds can provide comparable (within 90% similarity) ICS network behavior to a laboratory testbed.

The first clause of the hypothesis indicates that instead of a single, monolithic testbed, a framework will be created to allow for the construction of many independent testbeds; this framework will consist of discrete, replaceable components. From the second clause, the created testbeds will be interoperable with real ICS devices; this extends the usefulness of the virtual testbed, but also serves as a guarantee of realism — a virtual testbed that is not similar to a real ICS will not be interoperable. The third clause indicates that the virtual testbed behavior (especially with respect to network traffic) will be very similar to laboratory testbeds; this is defined in greater detail in Chapter 7.

This thesis describes the development and evaluation of an open virtual testbed framework to test this hypothesis. The design of the virtual testbed framework is broken up into discrete components. The main components are the process simulator and the virtual device; other components include a module for analyzing packet captures and a module for logging and creating virtual serial ports. Two simulated systems have been created for the testbed, and both have been designed to match existing laboratory testbeds in the MSU laboratory (Described in Subsection 2.2.1). These are the laboratory-scale pipeline and ground tank.

The following chapters detail the contribution of this thesis. Chapter 2 provides a summary of related work, including more information about ICS, IDS, and related testbed projects. Chapter 3 provides a survey of known attacks against common ICS wireless

systems to show how ICS wireless systems can be used to violate security assumptions in ICS; this motivates the need for further security research in ICS, particularly in IDS. Chapter 4 provides an overview of the virtual testbed design goals, components, use cases, and the two implemented systems. Chapter 5 discusses process simulation, while Chapter 6 describes the design of virtual ICS devices for the testbed. Chapter 7 discusses the verification methodology, and verification results, and use of the testbed. Finally, Chapter 8 provides conclusions and future work.

CHAPTER 2

RELATED WORK

2.1 Industrial Control Systems

Industrial Control Systems (ICS), also known as Distributed Control Systems (DCS), Process Control Systems (PCS), and Supervisory Control and Data Acquisition (SCADA) systems are computer systems used to monitor control physical processes in manufacturing, chemical processing, electric generation, electric transmission and distribution, water/wastewater systems, and other industries. ICS interconnect and monitor physical processes. An example ICS system is shown in 2.1.

ICS collect data from remote facilities about the state of the physical process and send commands to control the physical process creating a feedback control loop. At the center of Figure 2.1 is the Master ICS computer, termed the Master Terminal Unit (MTU). The MTU may be a personal computer or a programmable logic controller (PLC). The MTU interfaces with Human Machine Interface (HMI) software, and may also connect to a historian server (not shown) or the company's corporate network to allow engineers and managers access to information about ongoing processes. The master unit is connected to Remote Terminal Units (RTU), which may be termed "slaves" in some systems and protocols. RTU may be smart instruments themselves or computers or PLCs that interface with instruments, sensors, and actuators. Legacy ICS are connected over RS-232, RS-485,

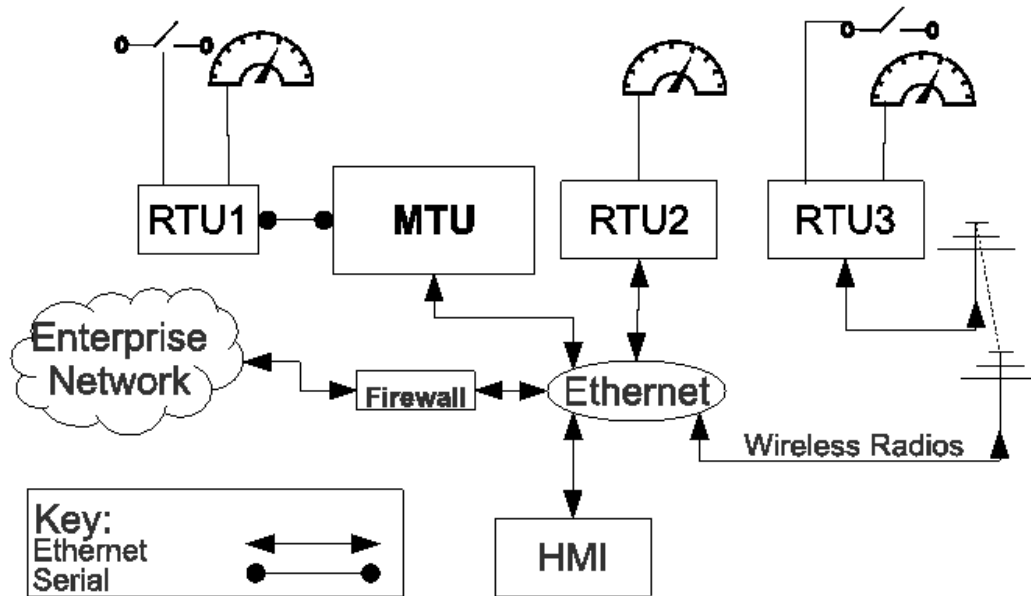


Figure 2.1

Diagram of an ICS System

and other directly connected physical media. Modern ICS can incorporate those media with Ethernet, Internet Protocol (IP), TCP, and/or UDP, and may be directly connected to the Internet, or connected to corporate intranets which may have connections to the Internet. In addition to the wired media of RS-232, RS-485, CANBUS, and Ethernet, ICS systems make use of a plethora of standards-based and proprietary short-range and long-range wireless protocols.

2.1.1 Programmable Logic Controllers

PLCs are digital computer systems that are designed to run industrial control systems. They feature robust, rugged physical designs to withstand rough industrial environments, and typically run embedded system or custom operating systems. Their primary purpose

is to send analog and digital control signals to physical equipment, The values of these control signals will be based on the PLC programming and analog and digital inputs. PLCs are primarily programmed using a graphical programming language known as “ladder logic,” which emulates the original control system paradigm of using physical relays to automate processes. However, they may also be programmed in a high-level programming language, such as C. Once programmed, PLC programming rarely changes. PLCs run a processing loop that consists of reading inputs, running ladder logic, and updating outputs appropriately. A single run of this loop is known as a “scan,” and the time from the start of one loop run to the next is known as the “scan time”

2.1.2 ICS Protocols

This section details two commonly used standards-based application protocols in ICS systems: Modbus and HART. These protocols are used to communicate between RTU’s, MTU’s, HMI software, and other ICS devices. Many ICS application communication protocols, including the ones listed here, lack authentication features to prove the origin or freshness of network traffic. This lack of authentication capability leads to the potential for external network penetrators or disgruntled insiders to inject false data and false command packets into a SCADA system either through direct creation of such packets or replay attacks. These attacks may take place in either a wired or wireless context.

2.1.2.1 Modbus

Modbus[54] is a common protocol used in industrial control systems and SCADA systems. Modbus uses a master-slave paradigm for communications. Within Modbus, there is no authentication of masters or slaves. Modbus may be carried over serial connections (RS-232 or RS-485) or may be carried over TCP/IP, which is known as Modbus/TCP[55].

The Modbus data model considers data elements as being stored in four tables, each consisting of: discrete inputs (1-bit) , coils (1-bit outputs), input registers (16-bit), and holding registers (16-bit). Discrete inputs and input registers are read-only, and the data comes from the device's analog and digital inputs. These tables are addressed independently, and the number of data elements in each table varies from device to device. Modbus data elements may be considered as the main memory of the device, or Modbus addresses may be mapped to the device's memory in some other fashion.

Modbus uses a request-response messaging paradigm between masters and slaves. A master will send a request, and the addressed slave will send a response. Broadcast messages from one master to many slaves are supported; in this case, the slaves do not respond. Slaves do not send messages without first receiving a request from the master.

A request message consists of a slave address, a function code, and data. Modbus/RTU packets include a CRC checksum after the data. The slave address is a unique number from 0-247, and the address is the first byte of the request. The function code is one byte specifies the type of request and what action should be taken by the slave. Example function codes are given in Table 2.1. Not all function codes are implemented for all devices. The data of the request varies based on the function code. For a "Read Holding Registers"

request, the data includes the number of registers to read and the starting address, while for a “Write Multiple Registers” request the data includes the starting address to write to, the number of registers to be written, the byte length of registers to be written, and the data to be written. Responses use an similar format to the request, although the data will differ. For a “Read Holding Registers” response, the message will contain the responding slave’s address, the function code, the number of data bytes, and the requested register data (and CRC in Modbus/RTU).

Table 2.1

Sample Modbus Function Codes

Function Code	Description
1	Read Coils
3	Read Holding Registers
6	Write Single Holding Register
16	Write Multiple Holding Registers

Daniel Grzelak performed a security analysis of Modbus/TCP networks. He notes that many Modbus/TCP devices have web interfaces, and he was able to find a number of SCADA devices open on the web[36]. Identification of Modbus devices can be difficult, as the protocol is simple and by itself gives little information about the devices in the system. Grzelak notes that web interfaces and DNS records can give clues about the type of device in use as well as manufacturer and other information.

2.1.2.2 HART

HART (Highway Addressable Remote Transducer protocol) is a fieldbus protocol used in 4 to 20 mA analog control loops. A 4 to 20 mA analog control loop is a method of analog control where a level is indicated electrically by a current in the range of 4 to 20 mA; it can transmit sensor values within a range (pressure, temperature, etc.) or control values (actuator positions, motor speed, etc.). HART provides advanced field device functionality, including configuration and debugging, by superimposing digital communications on 4 to 20 mA loops. A common situation in process control systems is the use of HART-compatible devices with non-HART compatible controllers. WirelessHART was developed to add to HART a wireless mesh network that permits use of HART data in non-HART control systems, the direct connection of PCs into the HART network, and the use of handheld devices in the HART network.

2.2 Related Testbeds

A number of universities and government agencies are developing or have developed testbeds for studying SCADA system attacks. These testbeds are outlined below; following that discussion, the ICS and Electric Grid testbeds at MSU are discussed in detail.

Giani et al. proposed, but did not implement, a SCADA testbed[34]. First, they defined reference architecture of a SCADA system (in a configuration similar to Figure 2.1). Next, the authors considered three types of testbed: single simulation (all in a simulation framework like MathWorks' Simulink), implementation-based (where real SCADA devices are used) and a federation simulation(simulation is combined with real SCADA devices). To

tackle the problem of device synchronization, the authors recommended the use of the US Department of Defense High Level Architecture system.

In a Master's thesis, David Bergman developed a simulated testbed for modeling Electric Grid SCADA systems [16]. A network simulator, RINSE, was used to model communications between simulated devices; these simulated devices include relays and data aggregators. PowerWorld software was used to simulate the Power Grid. This simulated testbed has the ability to be integrated with real hardware. This work, while featureful, will not be released to other researchers. Additionally, no verification was done to ensure that the simulated testbed traffic is similar to actual traffic. Furthermore, this testbed is aimed for electric grid control systems and not general ICS.

In [31], the authors take the approach of using a small "complex electromechanical device consisting of pipes, valves, sensors, pumps, etc" to model a power plant. Their system uses a number of different PLCs and field devices. They also use a DeltaV DCS system. They also included a small office intranet with interconnections with VLAN , VPNs, RADIUS, a DMZ and "external network" system. The authors have used this system to demonstrate four different attack scenarios.

[39] discusses the work of a senior design team at Iowa State University. They virtualize two substations controlled by a control center which includes an HMI. They also discuss possible attack vectors, including relay configuration changes, denial of service attacks, fabricating/modifying/disrupting alarms/data from relay, and injecting incorrect data into historian. [59] describes the use of a Lego NXT robotics kit to act as a physical system controlled by an ICS simulated with OMNet++. While the NXT provides a phys-

ical system, all ICS processing occurs in the simulation. HMI software is included in this testbed.

[23] uses the Command and Control Windtunnel discrete-event simulation framework with Simulink to create a simulation of a chemical processing plant. Information about plant variables is sent using Ethernet to simulated parts of the plant, but device semantics (including ICS protocols) are not simulated. The authors tested a DDoS attack against this system.

[56] describes a honeypot that emulates a TCP/IP-connected PLC using honeyd. The authors focused on emulating device appearance to an external attacker, and they include FTP, HTTP, and Telnet in addition to Modbus/TCP. They do not include a process under simulation, nor do they program behavior to initiate interaction with other devices.

2.2.1 MSU Lab

Mississippi State University's laboratory-scale process control system cybersecurity testbed uses process control system equipment to control and monitor small, laboratory-scale processes. MSU has two types of testbed: five laboratory-scale ICS and a laboratory-scale electrical substation (in which power flows are simulated). The ICS systems include an oil pipeline system, an oil storage tank, water tower, industrial air blower, manufacturing conveyor, rolled sheet metal plant. The rolled sheet metal plant and electric substation simulators use Allen-Bradley PLCs controlling their systems using the Ethernet/IP protocol. The remaining systems are controlled by single Control Microsystems PLCs commu-

nicating over Modbus wirelessly to a single master PLC unit, which is in turn connected to an HMI. The electric substation testbed is described in further detail in [64].

Two of the ICS systems — the pipeline and the oil storage tank — are discussed in later chapters, so a more thorough treatment of them will be given here. The oil pipeline model system consists of a pipe with a pump, an electrically controlled release valve, and a pressure meter, all connected to the controlling slave PLC. Air is used in place of oil for safety and simplicity. The system has three modes of operation: off, manual, and auto. In off mode, the slave closes the valve and turns off the pump. In manual mode, the pump and valve status are set by the master PLC based on input from the HMI. In automatic mode, a PID loop is used to maintain the pressure at a setpoint specified by the master PLC based on input from the HMI. Two modes may be selected: pump mode, where the valve is always open and the pump is modulated on and off to control the pressure, and solenoid mode where the pump is always on and the valve is opened or closed as necessary to control the pressure. The ground tank system uses water in place of oil for safety reasons, and consists of a plastic water tank, a reservoir, and a pressure gauge and a pump connected to the slave PLC. The reservoir holds water not in the tank, and the pump moves water from the reservoir to the ground tank; a pipe drains water continuously from the tank to the reservoir. Like the pipeline, the ground tank has auto, off, and manual modes. The off and manual modes work similar to the pipeline system. The auto mode has a low and high setpoint; the pump is turned on when the water level is below the low setpoint, and turned off when the water level is above the high setpoint.

The MSU Power Systems group has developed a smart grid testbed that models an electric transmissions substation for developing new algorithms for data management and decision making as well as cybersecurity testing. This testbed consists of a real-time digital simulator (RTDS) that is capable of simulating the physics of a power system. The RTDS is controlled by a support PC running RSCAD simulator control software. The RTDS is presently configured to simulate two transmission lines; analog outputs of this simulation is fed to General Electric Multilin PMU for monitoring. These PMU are connected over Ethernet to a Schweitzer Engineering Laboratories phasor processor PDC for aggregation and analysis. There is also one Allen-Bradley CompactLogix programmable automation controller (PAC) in the power lab for breaker control. Another CompactLogix PAC is located in the Center for Critical Infrastructure Protection in Butler Hall; it controls a model sheet steel processing plant, and is connected to the testbed LAN via an industrial 900MHz wireless Ethernet link. This model plant is to be considered a load in a future use of the testbed. The PMUs send voltage and current phasor data at a rate of 60 measurements/second to the PDC using the IEEE C37.118 synchrophasor communication standard. This connection uses TCP/IP over Ethernet. The PMU also support data streams via UDP/IP over Ethernet.

2.3 Intrusion Detection Systems

Intrusion detection systems (IDS) are computer systems that attempt to detect possible intrusions in a computer system. Two principal types are host-based and network-based IDS. Host IDS monitor single computers for intrusions; they typically ensure that sensitive

system files are not accessed or modified. Network IDS monitor network activity looking for network traffic indicative of network attacks and intrusion attempts. In this thesis, all references to IDS refer to network-based intrusion detection systems.

IDS performance is measured with four metrics: true positives, false positives, true negatives, and false negatives. These are described in the table below. True positives are malicious behavior that is detected as malicious, but false positives are benign behavior that is detected as malicious. True negatives are benign behavior that is recognized as benign, while false negatives are malicious behavior that is detected as benign.

Table 2.2

IDS performance metrics

Behavior	Detected: Benign	Detected: Malicious
Actual: Malicious	False Negative	True Positive
Actual: Benign	True Negative	False Positive

IDS may be anomaly-based or signature-based. Anomaly-based IDS use statistical and/or machine learning techniques to determine “normal” network behavior and to note deviations from normal as intrusions. They require training and are more prone to false positives, but they are also better able to detect new types of malicious behavior. Signature based IDS use compiled lists of signatures or rules that describe malicious behavior. Signature-based IDS are simpler to deploy, as they require no training. Also, as the signatures are based on known attacks, the false positive rate is much lower.

2.3.1 IDS Testing

Intrusion detection system testing is discussed here because it is expected to be a primary use case for the testbed. A number of projects have looked into the testing of intrusion detection systems. One of the first projects describes a testing methodology and an Expect-based framework for running attacks in a laboratory environment[58, 57].

An important milestone on the topic of intrusion detection systems was the DARPA Intrusion Detection System Evaluations[43, 25, 45], which generated the DARPA datasets. This project simulated a medium-sized US Air Force local area network using a number of hosts running Expect scripts to simulate user activity (mail, FTP, HTTP, telnet). In the simulated traffic, a number of known network attacks were performed. The captured data (9 weeks' worth) was condensed into the KDD99 Cup dataset [1], which provided researchers with a CSV file with connection information for the entire dataset; the KDD dataset was useful because it tagged which connections were malicious, making it possible to train and verify IDS that use machine learning techniques. The DARPA datasets, the first of their kind, did have a number of flaws which were only apparent in retrospect[19, 49]. One major issue was that it had not been shown that the DARPA network traffic, being simulated, actually resembled true network traffic. Another issue was that all packets had four possible values for the IP TTL field; benign packets could have one of two TTL values, and malicious packets used one of two others.

[60] discusses that author's experiences with benchmarking IDS systems and details a number of methodology flaws in commercial IDS product testing. [12] outlines the flaws in the existing IDS testing methodologies and calls for a new open-source IDS testing

methodology. [50] recommends the use of shared data of attack logs for IDS testing. [77] describes the application of mutations to known attacks to test the robustness of signature-based intrusion detection systems. In [84], Stefano Zanero provides a thorough discussion of necessary characteristics to measure intrusion detection system performance; these include true/false positives/negatives, coverage, resistance to polymorphism, throughput and latency, and response time (for intrusion prevention systems). Zanero then discusses issues generating background traffic (i.e. benign traffic) and attack sets. Zanero ends by stating that intrusion detection system testing is still an open problem and mentions future work similar to that proposed by Athanasiades et al.

2.4 PCS IDS

[83] discusses an anomaly intrusion detection system developed using a Matlab toolkit. To test its effectiveness, the authors used a testbed consisting of Sun Microsystems servers and workstations and ping flood, IP fragmentation, and LAND flood attack denial of service attacks.

[24] discusses the use of models for intrusion detection. Simply, model-based intrusion detection consists of creating a model of the expected behavior of the system and noting behavior that violates that model. Cheung et al. developed models for the Modbus specification, communication pattern models for their testbed equipment, and sensors for detecting server/service availability. The models for Modbus and communication pattern models were implemented as Snort rules. Their IDS was tested using a single multi-step attack scenario in Sandia National Labs' SCADA testbed, which consists of process con-

trol system equipment. In [65], Roosta et al. propose a model-based IDS for wirelessly connected process control systems. Their proposed system has both a centralized IDS at the network gateway and a distributed IDS at each radio node. They provide threat models and proposed policy. In [76], Valdes and Cheung extend their work in [24] to use a multilayer monitoring architecture for event correlation that uses model-based intrusion detection. Additionally, they present visualization tool for showing communication pattern anomalies

Hadeli et al. attempt to use machine-readable configuration files for creation of IDS rules in [38]. They developed a tool that combines ABB DCS configuration files and some user provided information to develop Snort and IP Tables rules. They also developed a Snort Preprocessor to look for absent traffic as a sign of malicious activity. The authors used laboratory equipment to validate the functionality of the system, but describe no actual attacks. Svendsen and Wolthusen argue for the use of IDS that use models of the process being controlled, not only models of the PCS equipment, for intrusion detection [72]. They also provide several models of hydroelectric plants to demonstrate how the process may be modeled. Valdes and Cheung also explore the use of network patterns and flows to detect communication anomalies with machine learning techniques [75]. They implemented this system in an Invensys distributed control system. They used an nmap scan and modscan[17] scan as attacks that their system successfully detected. Gao et al. describe the use of neural networks for detecting injected Modbus packets in a model water system testbed[33]. Digital Bond has developed rules and preprocessors to detect IDS attacks using the open source signature-based IDS Snort[3].

CHAPTER 3

SURVEY OF ICS WIRELESS ATTACK LITERATURE

As more robust radio solutions become available, wireless systems are becoming vital parts of ICS systems. They provide a relatively inexpensive way to add new communication links. Short-range wireless systems include IEEE 802.11 (Wi-Fi), IEEE 802.15.4, WirelessHART, and ZigBee, BlueTooth, and proprietary systems. Each system presents a unique set of security challenges. Each subsection provides a basic introduction to a system's technologies and applications, known security vulnerabilities, and mitigation strategies. Each section identifies attacks with an identifier in parentheses; this identifier is to aid the reader in clearly identifying references to attacks in later sections and was not assigned systematically.

The following sections detail attacks that are possible given that an attacker has "compromised" a node. A compromised node is a member of the target network that an attacker can control in some way; obtaining this level of control typically involves changing the software or firmware of the node to be malicious. A node may be compromised by an insider with physical access to a device or by an outsider with trojaned factory firmware or malware. In many cases, wireless devices are placed outside of an organization's area of physical control; examples include smart meters in customer's homes (in the Smart Grid Advanced Metering Infrastructure) or sensors placed in the field. In these cases,

even external attackers can be assumed to have physical access to the device and are able to exploit low-level design vulnerabilities. This can include sniffing bus traffic before it is encrypted, extracting and modifying the firmware, or bypassing or replacing hardware components[35]. If a node is controlled by a PC, as is common with Bluetooth or IEEE 802.11, an internal or external attacker can compromise that PC and thus also compromise the wireless interface.

3.1 IEEE 802.11

IEEE 802.11 is a standard for wireless local area networks. IEEE 802.11 networks, also known under the trade name Wi-Fi, are now ubiquitous in home, office, and educational environments. Wi-Fi systems are also increasingly used in industrial applications, and ruggedized access points are available for industrial use. IEEE 802.11 provides physical, MAC, and network layer services. IEEE 802.11 provides Ethernet access to operators' PCs as well as MTU and RTU. These systems have a short range, but many access points may be distributed throughout an area. Several amendments to the IEEE 802.11 specification have been approved to add features and define communications suites. 802.11 a, b, g, and n, approved in 1999 1999, 2003, and 2009 respectively, are communications suites. These vary in speed, effective range, frequency use, and modulation.

IEEE 802.11 provides multiple mechanisms for communication confidentiality and network access control. These include Wired Equivalent Privacy (WEP), now deprecated, and IEEE 802.11i. IEEE 802.11i is known as Wi-Fi Protected Access 2 (WPA2). Wi-Fi Protected Access (WPA) is a weaker subset of 802.11i and is now deprecated; it was

Table 3.1

IEEE 802.11 Vulnerabilities

Vulnerability	ID
WEP Key Recovery	WF1
802.11e/WPA-TKIP Packet Injection	WF2
802.11 MITM WPA-TKIP Packet Injection	WF3
WPA PSK Bruteforcing	WF5
WPA2 GTK Packet Injection	WF12
802.1X Credential Theft	WF6
Physical Layer Jamming	WF7
Short Interframe Space Jamming	WF8
Clear Channel Assessment Jamming	WF9
Deauthentication Forgery DoS	WF10
Disassociation Forgery DoS	WF11
Rogue Access Point	WF14
EAP Offline Dictionary Attack	WF13

intended as a “stop-gap” measure that could replace WEP in older hardware with only a firmware upgrade. IEEE 802.11i is a direct replacement for WEP, which was found to have a number of security vulnerabilities (discussed in the next paragraph). IEEE 802.11 also supports the IEEE 802.1X standard for port-based LAN authentication. 802.1X is popular in enterprise 802.11 networks where preshared keys are undesirable. The standard itself mandates the use of the Extensible Authentication Protocol (EAP), of which there are several varieties, including EAP-MD5, EAP-TTLS (Tunneled transport layer security), LEAP (lightweight EAP), and Protected EAP (PEAP).

The first attack against WEP was published in 2001[30]. This technique attacks the RC4 encryption scheme used in IEEE 802.11; in the attacker’s best case, he can recover the key with 1,000,000 captured encrypted packets (*Attack WF1*). In the latest attack [74],

an attacker can recover the encryption key and can have full access to the wireless network under attack by sniffing only around 24,200 packets; this is possible in under 60 seconds.

Two attacks against WPA using the Temporal Key Integrity Protocol (TKIP) were discovered in 2009. The first attack (*Attack WF2*) works against networks using 802.11e Quality of Service features [73]. The 802.11e amendment specifies 8 priority levels for traffic to permit higher-priority traffic to have a lower latency. This attack can allow an attacker to inject up to 7 packets in 12 minutes; 12 minutes is required to gather enough traffic to perform the attack, and 7 packets are available from the remaining priority levels which may have a replay counter low enough to let the injected packets pass. Although this is a small number of packets, precision packets may be crafted that can cause systems to crash or otherwise exhibit undesired behavior. One example of a small attack packet is a Local Area Denial of Service (LAND) attack. In a LAND attack, an attacker sends a TCP/IP or UDP/IP packet with source and destination IP and port numbers equal; LAND-attack vulnerable systems will continuously send responses to this first packet back to itself and prevent other connections from taking place. Attack *WF2* has been extended to obtain up to 586 bytes of keystream; this allows an attacker to inject larger packets than was possible with the original attack[40].

The second attack (*Attack WF3*) against WPA will work against any WPA TKIP network; this attack uses a man-in-the-middle approach and can provide an attacker one short packet injection every minute[53].

Finally, WPA using the pre-shared key (PSK) mode is vulnerable to offline brute-force key guessing if the connection handshake can be eavesdropped and the key is too short

(*Attack WF5*) [11, 52]. This handshake can be forced by briefly using the deauthentication denial of service attack (*WF10* or *WF11*, discussed below). For WPA-PSK, the use of a random 16-hexadecimal digit number is recommended; the use of passphrases for WPA preshared keys is not recommended as they are more likely to be in dictionaries [52].

Another attack (*Attack WF12*) that effects both WPA and WPA2 is not a cryptographic break but rather exploits the usage of keys for all clients using an access point. There are two keys used by WPA and WPA2 access points to encrypt communications with clients: the Group Temporal Key (GTK) and the Pairwise Transient Key (PTK). The GTK is used to encrypt broadcast messages from the access point to all clients; all clients associated with an access point share a GTK. Separate PTKs are established between the access point and each client. The individual PTKs are meant to protect each client connection from network attacks, like sniffing other clients' traffic or injecting messages to other clients, from (rogue) authorized clients. However, clients will readily accept spoofed messages encrypted with the GTK [9]. This allows an attacker who has authenticated with the access point to perform several attacks. The first of these is that an attacker may become a man-in-the-middle between two clients by ARP spoofing; by using the GTK flaw, the attacker can perform the ARP spoofing in an encrypted channel over the air, where traditional IDS can not detect the attack. A second attack permits the attacker to send any TCP/IP payload to a client; this payload may be a TCP/IP packet attack (like a LAND attack), or malicious code. With the GTK, an attacker can perform a third attack: a denial-of-service against the other clients associated with the access point. Each WPA2 packet contains a 48-bit packet number that is meant to act as a replay counter – packets with packet numbers lower than

the highest seen by a client are dropped. An attacker using the GTK vulnerability can spoof a packet with a very high replay counter, and cause all legitimate group-addressed packets to be dropped; this can cause a client to not respond to an ARP request and prevent IP traffic from reaching that client.

An attacker can sidestep authentication mechanisms entirely by establishing a rogue access point (*Attack WF14*)[70][14]. This attack is also known as an “evil twin” attack. In this attack, an attacker establishes his own IEEE 802.11 access point that broadcasts the same service set identifier (SSID) as the network being targeted. If this rogue access point happens to have higher signal strength than a legitimate access point, victims will switch from the legitimate access point to the rogue access point. These victims will provide authentication information to the rogue access point which the attacker can then use to gain access to the legitimate network.

In addition to the vulnerabilities in WEP and WPA, there can be problems with 802.1X authentication as well. Many PEAP supplicants (user clients) are configured to not authenticate the RADIUS authentication server; an attacker can set up a rogue access point using a fake RADIUS server to steal the authentication details (user name, password or challenge and response) in systems using EAP-TTLS and PEAP (*Attack WF6*) [82]. This may be mitigated by requiring all clients to verify the certificates of the servers they are trying to connect to. Additionally, tools have been released that can perform an off-line dictionary attack against LEAP, EAP-MD5, and systems that use MS-CHAP (Microsoft Challenge Handshake Authentication Protocol)(*Attack WF13*) [79, 80]. As this is a dictionary attack,

systems using weak passwords are most vulnerable. These attacks grant authentication information that an attacker may use to infiltrate a network.

Additional attacks have been found against the IEEE 802.11 protocol itself, not just the authentication mechanisms, and include denial of service attacks and man in the middle attacks.

IEEE 802.11, like all wireless systems, is vulnerable to physical layer jamming (*Attack WF7*). Physical layer jamming can be as simple as a single RF oscillator transmitting on one channel of the transmission band, or may be as sophisticated as monitoring the state of each protocol packet to predict the optimal time and period to jam to minimize throughput[13].

IEEE 802.11 is vulnerable to two MAC layer denial of service attacks against its carrier sense collision detection mechanisms. The first of these involves the waiting period between frames (*Attack WF8*). An 802.11 radio waits a brief period before transmitting to check to see if the channel is in use; this period is known as the Short Inter-frame Space (SIFS). If an attacker transmits briefly during this space, other radios will wait to transmit. This process could be repeated indefinitely, denying service to the network[15]. However, this attack is power-intensive and would require a transmission rate of 50000 packets/second. In the second attack (*Attack WF9*), the clear-channel assessment (CCA) mechanism of 802.11b devices is attacked. The clear-channel assessment mechanism is used to prevent collisions, and actually operates below the MAC layer. To attack the CCA of a device, another 802.11b device can be placed into a debugging mode that continuously transmits; this continuous transmission is seen as network activity by the CCA and prevents other

devices from transmitting[5]. This continuous transmission forms a simple yet effective denial of service attack.

The network layer is also vulnerable to denial of service attacks[15]. During connection, a client must first authenticate with an access point, then must associate with a given access point. The association step is required because a client may authenticate with more than one access point at a time (for example, in a plant-wide IEEE 802.11 network) but may only be associated with a single access point for network access. The IEEE 802.11 standard defines a 'deauthenticate' packet used to end a connection; the packet is sent from the client to the access point to indicate an end in connection. This packet is unauthenticated and can be spoofed by an attacker. An attacker can generate deauthenticate packets with the address of one victim, many victims, or even the entire network (*Attack WF10*). This packet can be flooded or used only when a victim reconnects to the network to create a full denial of service attack. A similar attack (*Attack WF11*) is possible with the disassociation packet, although that attack requires slightly more power on behalf of the attacker. More power is required in the disassociation attack because more time is necessary for a client under attack to reauthenticate and then reassociate than to merely reassociate; the faster a client can reauthenticate and/or reassociate affects the rate at which deauthentication or disassociation packets must be sent, and thus power expended.

The use of only WPA2 encryption is recommended for IEEE 802.11 networks. While this may seem obvious to enterprise security professionals, it is important to clearly state because some recent, popular industrial access points do not support WPA2. Additionally, strong passwords/preshared keys are essential to preventing dictionary attacks. Finally, in

deployments making use of 802.1X with PEAP, all supplicants should be configured to verify the certificates of the enterprise RADIUS server.

3.2 IEEE 802.15.4 PHY and MAC Layer

The IEEE 802.15.4 networking standard describes a common physical and MAC layer for Personal Area Networks (PANs). It is meant to be a common underlying layer for development of many different low-power, short-range wireless communication protocols. Use of a common layer allows for more rapid development of different protocols for different purposes. 802.15.4 protocols that may be found in critical infrastructure include WirelessHART, ZigBee, and ISA 100-11a. While a common base allows for easier development of standards as well as product development, vulnerabilities present in the 802.15.4 standard will likely be present in devices making use of any of the above listed protocols. For this reason, 802.15.4 vulnerabilities are treated in this separate section.

Table 3.2

IEEE 802.15.4 Vulnerabilities

Vulnerability	ID
AES-CTR Packet Corruption	E1
AES-CTR Replay Counter Abuse	E2
Physical Layer Jamming	E3
Acknowledgement Fabrication	E4

The 802.15.4 standard mandates the use of the CCM* mode of AES for encryption. CCM* provides several security suites: AES-CTR provides message confidentiality by

encrypting data payloads, AES-CBC-MAC ensures message integrity with a 32, 64, or 128-bit message authentication code (MAC), and AES-CCM combines the two former suites. In the AES-CTR mode, a cyclic redundancy check (CRC) is used to provide message frame integrity. This is insecure as it makes the following attack (*Attack E1*) possible [66]. Suppose Alice is sending Bob a message routed through Mallory. Mallory may change the cipher text without decrypting it, because she knows that it will do damage to the plaintext (by the avalanche effect). Mallory then retransmits the bad ciphertext with a *valid* CRC. The packet will be accepted by Bob as “good” when, in fact, it has been modified. When the payload is decrypted and the data is given to the application layer, it will not be valid.

802.15.4 provides replay protection in the form of key and frame counters. Each packet is numbered with these counters. If a device receives a frame that has key or frame counters lower than the highest one seen by that device, the frame will be ignored. In the AES-CTR mode, which provides no cryptographic integrity protection, it is possible for an attacker to forge a packet with the maximum values of frame and key counters and send it to any device in the network (*Attack E2*)[66]. This packet will cause any subsequent frame (which will necessarily have a lower frame and key counter value) to be discarded; this effectively forms a denial of service to the device that received the forged packet.

Physical layer jamming attacks (*Attack E3*) have been implemented against a popular 802.15.4 device (Texas Instrument’s CC2480 transceiver)[18]. This transceiver transmits at 1 milliwatt using a “nearly isotropic” antenna; it is specified for use up to 100 feet (approximately 30 meters). The test setup used placed two CC2480’s 1.2 meters apart.

A simple, inexpensive jamming unit consisting of a voltage-controlled oscillator and a mixer unit was able to jam communications between the two devices from 15 feet (4.6m) away from the two devices under test; this test used the same power output and similar antennas to the CC2480. This distance could be greatly increased by the jammer's use of higher-gain antennas and amplifiers.

While this test shows the effects of continuous jamming, selective jamming attacks against IEEE 802.15.4 have also been studied[71]. A Universal Software Radio Peripheral (USRP) can be used to briefly corrupt portions of packets as they are transmitted; this has the effect of causing CRC and MAC checks to fail and for a receiver to drop the packets that are jammed. Advantages of selective jamming are low power usage and low probability of detection, as the short bursts use little power and they are too short to be seen on a spectrum analyzer. Such selective jamming can be made more effective if the attacker fabricates an acknowledgment from the recipient to the sender [66]. In IEEE 802.15.4, acknowledgments are optional, requested by the sender, and not authenticated; the lack of authentication makes it possible for an attacker to falsify the acknowledgment to prevent the sender from attempting to retransmit[66].

IEEE 802.11b,g,n radios and IEEE 802.15.4 radios both operate in the same 2.4 GHz ISM band. Because of this, it is possible for IEEE 802.11 radios to unintentionally jam IEEE 802.15.4 radios. As few as four 802.11 radios operating on different channels could effectively cover the entire frequency space used by 802.15.4 devices[18]. Fortunately, it requires significant 802.11 network traffic to cause disruption to the 802.15.4 devices.

However, system planners should carefully manage the wireless systems used to prevent spectrum conflicts between systems.

One mitigation strategy against jamming is to use directional antennas. These antennas will reduce noise, improve signal strength and throughput, and make jamming by a malicious attacker more difficult. A drawback to directional antennas is that they will reduce the effectiveness of mesh networks; as the transmission area is no longer omnidirectional, fewer nodes will be within communications range. A second strategy is to place central wireless devices as close as possible to ground level to minimize exterior interference (malicious or otherwise). Using directional antennas to target the more central devices will cause exterior interference to be filtered out of the network[18].

It is recommended that critical infrastructure control systems employ devices that use the more effective AES-CBC-MAC and AES-CCM modes of encryption in their implementations and employ the wireless practices given in the previous paragraph to prevent intentional or unintentional jamming.

3.3 WirelessHART

HART is a digital communication protocol used in industrial control systems, and WirelessHART is an advanced wireless extension of that protocol. WirelessHART uses the 802.15.4 physical layer, and implements a pseudo-random channel hopping scheme that allows for frequency-hopping spread spectrum (FHSS) operation. WirelessHART defines its own MAC and data link layer[69]. WirelessHART networks consist of field devices, adapters, handheld devices, and gateways[61].

Table 3.3

WirelessHART Vulnerabilities

Vulnerability	ID
TDMA Desynchronization	WH1
Packet Flood Attack	WH2
Gateway Spoofing	WH3
Advertisement Saturation	WH4
Wormhole Attack	WH5
Traffic Analysis	WH6

Field devices are sensors and actuators which are WirelessHART capable; adapters permit the connection of wired HART devices to the WirelessHART network. Handheld devices may be carried by personnel to connect to devices wirelessly to configure, debug, or poll them for data. Gateways are nodes that connect the wireless network to the rest of the automation network; additionally, all network devices have sessions established with the gateway.

Confidentiality and integrity are provided by the AES-CCM suite from 802.15.4. All network traffic is encrypted by default in WirelessHART networks. Security for packets passing from radio to radio is provided by encrypting all data link layer protocol data units with a network key known by all devices in a network. End-to-end confidentiality and availability is provided by use of session keys. For example, suppose Alice wants to send Bob a WirelessHART message. Alice will encrypt the message with the session key she has established with the gateway; she will then send that message to the gateway. The gateway will decrypt and re-encrypt the packet with the session key Bob has established with the gateway. Although sessions would be possible without going through the gateway,

it is forbidden by the WirelessHART standard to do so. WirelessHART is vulnerable to attacks at the MAC, Data Link, and Network layers[62].

The MAC layer offers the opportunity for a type of denial of service attack known as a desynchronization attack (*Attack WH1*). A desynchronization attack causes a node under attack to become desynchronized from the rest of the network. In a TDMA scheme, like the one used in WirelessHART, this can cause transmission and reception slots to start and end at the wrong points, garbling the intended message. The desynchronization attack requires a compromised node (a network member under an attacker's control) to send improper synchronization information to a node under attack[62].

A denial of service attack (*Attack WH2*) is also possible at the data link layer. A node that knows the frequency hopping sequence can flood data link layer packets that have valid CRC's into the network. These messages will require computation and verification of the message integrity code (MIC) – an expensive cryptographic operation – by the recipient. Many of these packets sent at once will hurt the real time requirements of the network by preventing legitimate traffic to pass[62].

Several attacks are possible at the network layer[62]. The first of these is gateway spoofing (*Attack WH3*). In this attack, an attacker places a false gateway node in range of the targeted nodes. In WirelessHART, gateways authenticate nodes, but nodes don't authenticate gateways. This makes it possible for an attacker to create a false gateway eavesdrop, modify data in transit, or to selectively deny service to some or all network nodes.

Another network-layer denial of service attack is also possible (*Attack WH4*) as network join requests or advertisements can be spoofed by being encoded with the well-known key. The well-known key is published in the standard, is known by all devices, and is used for initializing a network connection. These spoofed requests and advertisements can be flooded until the network is saturated.

Yet another attack is the wormhole attack (*Attack WH5*)[62]. In this attack, a fast link – the wormhole – is introduced between geographically distant nodes. A wormhole might be a higher data rate wireless connection or a wired link. Because mesh networks are self-optimizing, this wormhole induces a significant amount of traffic to travel through it instead of slower routes with more nodes. Once a wormhole is established, an attacker is able to eavesdrop on all traffic that passes through the wormhole. Additionally, the attacker has the option of dropping packets selectively; the attacker must do this sparingly, however, because if too many packets are dropped the network will route around the wormhole. This attack is quite difficult to perform in practice. It requires both a compromised network node and a wormhole connection, like a wired path or very fast, reliable wireless link. Additionally, the attacker would need knowledge of the session keys to interpret data sent through the wormhole.

Eavesdropping threats are of concern in all wireless networks. In WirelessHART, data link layer frames are authenticated with a network key, and network data is protected by session keys. However, the source/destination addresses are sent in the clear; this enables traffic analysis by an attacker with radio access (*Attack WH6*)[62]. An attacker can analyze traffic patterns and determine the size of the network as well as periods of activ-

ity. Fortunately, eavesdropping payload contents is considerably more difficult; it requires knowledge of the session keys between two devices, or a cryptographic break in AES. Traffic analysis is possible when an attacker is within radio range, as is eavesdropping.

Many of the attacks discussed here, like the rogue gateway attack, are protocol vulnerabilities and cannot be easily mitigated. Following good physical security procedures and the recommendations from the 802.15.4 section above are a good start to mitigating these attacks.

3.4 ZigBee

ZigBee is a low-power, low-data rate wireless protocol for use in Personal Area Networks(PANs). Sample applications include industrial and home automation[6]. ZigBee is built on the MAC and physical layers of IEEE 802.15.4; specifically, the ZigBee standard defines network and application layer behavior. ZigBee provides three network topologies: tree, star, or mesh; any of these may be used, depending on the application. ZigBee networks are initialized and maintained by a node known as the coordinator; in a star topology, the coordinator is the central node.

Table 3.4

ZigBee Vulnerabilities

Vulnerability	ID
Plaintext Key Sniffing	Z1
Association Flood	Z2
Frame Counter DoS	Z3
Compromised Node	Z4

ZigBee uses security features from IEEE 802.15.4 in the physical and MAC layers in addition to adding network layer security. ZigBee uses the AES-based CCM* from IEEE 802.15.4 for network layer cryptographic services. Two feature sets are provided in ZigBee 2007, the most recent standard: ZigBee and ZigBee PRO. ZigBee PRO offers support for larger networks and support for two security modes: standard and high[6].

Three types of cryptographic keys may be in use in ZigBee network: network, link, and master[7]. The network key is common to all devices in the network, and is used for broadcast messages. Each link key is only known to two devices, and is used for unicast messaging between devices. The master key is used in generating link keys, and may be provided to a ZigBee device by the manufacturer, the trust center (discussed next), or by a user. ZigBee uses a trust center to handle key management; this trust center can manage only the network key, or it can manage the network key and all link keys. The trust center is tasked with establishing and changing encryption keys in the network.

There are known vulnerabilities in the ZigBee network layer. In some networks, depending on trust center implementation, the network and/or master keys are distributed to nodes as plaintext[7]; this may be sniffed by an attacker and used to decrypt messages or to inject properly-signed and encrypted messages[81](*Attack Z1*).

Additionally, an attacker may also conduct a type of denial of service attack known as an association flooding attack (*Attack Z2*) against the ZigBee coordinator[44]. In this attack, an attacker's device sends many association requests on behalf of non-existent devices. This action depletes the coordinator's typically limited memory and prevents it from associating legitimate devices [44, 81].

To prevent replay attacks, ZigBee network-layer packets use a frame counter; it is possible to conduct a network-level denial of service by spoofing a message with the frame counter set to the maximum value to a device (*Attack Z3*)[68]. Any legitimate message received by the device after the spoofed message will be regarded as old or replayed and then discarded.

Another attack is that it would be possible for the attacker to drop or misroute packets (*Attack Z4*) if an attacker can compromise a node in the network; this is especially dangerous in tree topologies. If the ZigBee coordinator device were compromised, in the star topology all traffic would be vulnerable to inspection or to being dropped. A problem with the 802.15.4 cryptography system is inherited by ZigBee; namely, the danger of the AES-CTR suite of CCM*, which uses only a CRC for integrity[68].

While some of the attacks mentioned in other sections have not been implemented, many attacks have been published for ZigBee. A Python language framework for ZigBee security evaluation, KillerBee, is available[81]. KillerBee uses a PC ZigBee device to listen and connect to ZigBee networks. Provided tools include zbdump, zbsniff, zbasocflood, and zbfnd. zbdump captures and logs all ZigBee frames seen by a device. zbsniff finds encryption keys sent across the network as plaintext, which sometimes occurs in the standard if keys are not distributed out-of-band or using symmetric-key key exchange(SKKE¹). zbasocflood will perform an association flood against a device. zbfnd provides a GUI for approximating the distance of nearby devices in real-time, allowing for the location of ZigBee devices in an area. KillerBee has been used to develop an ex-

¹SKKE uses the master key to derive link keys

tension for the Python packet manipulation module Scapy to permit easier development of attacks. A higher-level Python interface, ZBForge, is also available; ZBForge has been used to implement *Attack Z3*[71].

It is recommended that security features be enabled at the MAC, network, and application layers, including network encryption, MAC-layer access control lists, secure network joins, and link key-based encryption. Encryption keys should be loaded out-of-band (not over the ZigBee network). Additionally, the address of the Trust Center as well as an explicitly designated ZigBee coordinator and backup coordinator should be preloaded when possible[47].

3.5 Proprietary Wireless

In addition to the standards-based wireless systems discussed previously, a number of closed, proprietary wireless systems are also used in ICS. These vary widely in purpose and performance; some are designed to provide short-range communications, and others are meant for longer-range links. Some of these systems may be as simple as devices that send single analog values to a PLC. Others may be used for transmitting MODBUS or DNP3 data packets, while others still may be used for wireless Ethernet using proprietary protocols (distinct from IEEE 802.11). Examples are given in table 3.5.

Due to the closed nature of these systems, as well as the small market share of any single system, there are very few published security analyses of proprietary systems. However, the security of one proprietary wireless modem used for short- or long-range communication in ICS has been studied[63]. The results are detailed in the remainder of this

Table 3.5

Example Proprietary Wireless Systems

Manufacturer	Model
Avalan Wireless	AW900xTR
Banner Engineering	SureCross Data Radio
Freewave Technologies	Ranger R
GE MDS	Mercury 900
OMEGA	MWTC-REC6

section. This work demonstrates evidence that proprietary systems are no more secure than their standards-based peers.

As the problems discussed in that paper have not been patched by the vendor, neither the vendor nor the model are named explicitly. The radio operates with spread-spectrum frequency hopping in the 900 MHz unlicensed ISM band, and acts as an RS-232 serial wire replacement. The vendor promises that its spread-spectrum technology is sufficient to prevent detection and unauthorized access, and that confidentiality is guaranteed by a proprietary encryption. The radios will operate in one master, single slave or a one master, many slave configuration. Authentication is provided either by a 12-bit network identifier that is programmed into all radios or by programming all slaves with the serial number of the master radio.

In this system, it is possible to discover all master-slave networks in an area by using a radio of the same or similar model (*Attack P1*). With network identifier authentication, the entire space of all network identifiers can be searched in less than 22 hours; with master serial authentication, all possible values can be tested in 46 hours. This attack is

Table 3.6

Proprietary Wireless System Vulnerabilities

Vulnerability	ID
Network Discovery	P1
Slave Eavesdropping	P2
Slave Packet Injection	P3
Slave Denial of Service	P4

fully automated and is trivially parallelizable. Once a network has been discovered, only the knowledge of several radio parameters (hop sequence, data rate, et cetera) prevent an attacker from joining the network with full access as a slave unit. Anecdotally, one control engineer remarked that he used the known default values in 95% of his firm's installations of this device. In that event, the attacker can have instant access; otherwise, an exhaustive search of the radio parameters is required. This search will take no longer than 39 days to gain an attacker full slave access, and the search is trivially parallelizable. Additionally, these radios are in fixed placement and will likely not be relocated during the search.

As a rogue slave unit in this proprietary network, the attacker may eavesdrop on any data sent from the master to any slave (*Attack P2*). No data encryption is seen by the attacker. Additionally, the rogue slave may inject its own data into the network (*Attack P3*). Also, this particular radio protocol has no contention arbitration amongst slaves – a slave may transmit continuously, and other slaves will wait indefinitely for the first slave to finish. An attacker can use this to mount a simple, though effective, denial of service to slaves attempting to transmit to the master (*Attack P4*). Fortunately, master to slave communication is unaffected. This lack of contention is not just a danger from malicious

attackers; a faulty device could generate a stream of data and slow or completely hinder communication from other slaves.

3.6 Bluetooth

Bluetooth wireless technology is a standard for low-power, short distance radio communications. It is perhaps best known for its use in portable devices, in particular mobile phones. The technology is not as pervasive as others in ICS, although it does merit consideration by control systems engineers. Within ICS, it can be used as a serial replacement or embedded in devices outright. It can be used to connect permanent devices — sensors, actuators, controllers, et cetera — or to allow a control operator to connect a laptop or handheld device to the ICS network[10].

Similar to 802.11 networks, Bluetooth technology makes use of Frequency Hopping Spread Spectrum (FHSS) transmission in the 2.4 GHz international ISM band. Bluetooth devices can have a transmission power of 1, 10, or 100 mW, and a corresponding radio range of 1–100 meters. Bluetooth version 2.1 was published in 2007; this version contains significant improvements in security. All Bluetooth devices have a unique 48-bit hardware device address; the first three bytes at this address correspond to the device manufacturer, and the remaining three bytes are assigned by the scheme of the manufacturer's choice. This address is known as the BD_ADDR and is analogous to the MAC address assigned to Ethernet network devices.

Bluetooth security is heavily dependent on how a device is configured. Specifically, a device can be set to one of 3 security levels[37]: public, private, or silent. A device in

public or “discoverable” mode broadcasts its existence and availability for connection. In private mode, a device will allow connections if addressed by its BD_ADDR, but does not broadcast its existence explicitly. In silent mode, a device will accept no connections.

Devices can also be configured to use encryption using the E0 cipher, which is specified in the Bluetooth standard. Bluetooth encryption allows for a variable key size up to 128 bits. Only the data payload of a Bluetooth packet is encrypted. Bluetooth devices are “paired” in a master-slave configuration. In versions prior to 2.1, the same PIN code must be entered into both devices (or hard coded in devices without human interfaces). The PIN code is used to create an initial key, which is then used to establish a link key. The link key is used to re-pair the devices; a PIN is not required until a device forgets the link key. Examples of when a device may do this include a memory reset or upon user request.

The link key is also used to generate the encryption key. Beginning with Version 2.1, Bluetooth uses a new pairing mechanism called Secure Simple Pairing(SSP). Prior to 2.1, the only source of entropy in the pairing process was the PIN; in SSP, the Elliptic Curve Diffie Hellman (ECDH) key exchange protocol, with greater entropy than a 16 digit pin, prevents eavesdropping. The pairing protocol can prevent man-in-the-middle attacks by presenting a six-digit number on both devices being paired; these will match if there has not been a man-in-the-middle attack.

Several vulnerabilities exist against Bluetooth, although almost all of them affect versions prior to 2.1. Those that are effective against version 2.1 devices and beyond will be noted accordingly.

Naturally, as Bluetooth uses a wireless medium, it is vulnerable to physical layer jamming (Attack BT1). Since Bluetooth shares many of the same characteristics as IEEE 802.15.4 networks, it is vulnerable to the same types of jamming[18]. Additionally, Bluetooth devices are meant to be limited in range — no more than 100m, typically. Several researchers have demonstrated the ability to eavesdrop and communicate at ranges from 788m(.49 mi) to over 1700m (1.08 mi) (Attack BT2).[28, 4] The results depended on good directional antennas and geographic considerations (line-of-sight, altitude, or proximity to water). With good equipment, however, it is even possible to communicate at range through buildings[28].

While public/discoverable devices may be found by any nearby Bluetooth device, private devices may only be found and connected to by addressing the device by its BD_ADDR. Because of this, private devices are more secure against attackers attempting access. However, BD_ADDRs can be obtained as a precursor to other attacks using two methods. The first of these uses direct brute forcing (Attack BT3). If the manufacturer of the given device is known, the minimum time required is approximately 2.6 years[37]. A second technique (Attack BT4) to obtain a BD_ADDR is to sniff for the channel access code (CAC) in broadcast packets, which is related to the BD_ADDR[28]. Using this method, less than 22 minutes are required to arrive at a BD_ADDR, as only 8 bits must be brute forced. Although it has not been tested, this technique should also work against version 2.1 devices.

Knowledge of the BD_ADDR is a precursor to connection and also to other attacks. For example, once the BD_ADDR of a target is known, it is possible to place a Bluetooth

device modified to use the same BD_ADDR as the target (Attack BT5). When the second device receives transmissions addressed to the target, it will also respond. This response occurs at the same time as the first, and will effectively jam the target.

It is possible for an attacker who can eavesdrop on a PIN exchange to quickly obtain the PIN by brute force (Attack BT6)[67]. Using a 3 GHz Pentium 4 PC, it is possible to arrive at a 4-decimal-digit PIN within 60 ms — near real-time. This delineates a risk of rogue connection to devices configured to use a static PIN. A utility, BTCrack, is available that can use this attack to take encrypted pairing data and arrive at both the PIN and link key[2]. The link key can be used to authenticate an attacker's rogue device to the sniffed target, connect to that device, and manipulate the device directly[27]. The link key can also be used to decrypt eavesdropped exchanges between devices, betraying the confidentiality of the system. These flaws were corrected in the new security provisions of Bluetooth version 2.1.

Bluetooth technology is also used in many laptop and handheld devices; these devices depend on properly implemented device drivers to function correctly and securely. Flaws that gave full directory access(Attack BT7) have been discovered in the Bluetooth software stacks from Apple, BlueSoleil, Toshiba, and Widcomm; together these stacks represented a significant portion of the PC Bluetooth device market. These vulnerabilities were later patched; however, patches are often not applied in critical infrastructure systems.

There are several strategies to consider when using Bluetooth technology in industrial and critical infrastructure environments. First, long-distance communication is certainly possible for a motivated attacker. The physical security and low radio range, even tak-

ing into account site dimensions, cannot be depended on to solely provide security for Bluetooth networks. To prevent eavesdropping and data injection, 128-bit encryption keys should be used in every application possible. (32-bit encryption can be cracked in under a hour with a desktop machine [37]). The authors also highly recommend migrating to Bluetooth 2.1 devices whenever possible. In cases where legacy versions of Bluetooth (earlier than 2.1) must be used, it is important to use long pins, with non-numeric characters when possible. Finally, leaving devices in private or silent mode is advisable as it significantly increases the complexity for an attacker to connect to devices.

CHAPTER 4

OVERVIEW OF VIRTUAL TESTBED

The development of security practices and techniques in the realm of process control systems has lagged the development seen in traditional information technology. However, researchers and industry practitioners have taken notice of the issue and are developing best practices, secure protocols, and intrusion detection systems to meet the security needs of process control systems. These research efforts are hampered by the lack of an open, virtual testbed for ICS security research. One purpose of this testbed project is the creation of an open, sharable system that can be made freely available for the use and modification by other researchers. This will provide substantial benefits to the ICS security research community. First, it will allow the replication of research on systems that can be common to all researchers; published findings can be verified and improved without having to rely on features that are present only in one researcher's testbed. Second, other researchers can contribute new protocols, device types, and instances of ICS systems that can be shared and distributed widely. Third, and perhaps most importantly, errors and biases found in captured traces can be corrected and new captures generated and shared; having a "living library" of captures avoids the issues found in similar IDS testing approaches involving libraries of traffic captures discussed in Chapter 2.

This chapter provides an overview and description of design goals, components, and use cases of such a virtual testbed. A section discussing logging techniques is also provided.

4.1 Design Goals of Virtual Testbed

The virtual testbed should meet two sets of goals: functional goals, which govern what the testbed should be able to do, and characteristic goals, which govern qualities that the testbed should have.

The main functional goal of the testbed is to be able to emulate realistic serial and TCP/IP ICS protocol communications. These captures must be realistic in protocol features, ICS system behavior, and include ICS data. Ideally, captures from a real system would be indistinguishable from captures from the virtual testbed; this will likely never be the case, though, so it is important that amount of similarity of traffic be known quantitatively. In addition to the ICS traffic, it is important that the process under virtual ICS control can also be shown to be similar to actual physical processes.

Captures of the network traffic, to be effective for research purposes, must be logged reliably; logging should be done with a minimum effect on the ICS traffic itself, and with sufficient precision and accuracy to fully describe the behavior of the system. In addition to exhibiting realistic traffic, the testbed should also be able to interface with actual ICS system equipment. This helps to ensure that the testbed has behavior compatible with real ICS systems, and facilitates the use of the system as a “backend” for research on equipment

vulnerabilities. This requirement dictates that the virtual testbed must be capable of soft real-time operation.

In order for the benefits of an open system to materialize, the virtual testbed system must be flexible and easily extended. Each component should stand independent of other components; no individual component must be essential to operation. This aids in the objective that the virtual testbed integrate with existing systems; it also allows researchers to adapt other projects to work alongside this virtual testbed. Examples include the ability to include PMU and PDC instances from the OpenPDC project, or to integrate other software virtual testbeds.

This principle of “interchangeable parts” dictates that components must have well-defined, modular interfaces. Application of this principle mandates that data sharing between components should be standardized internally, if not standards-based. Another implication is that it should be very simple to convert systems using one ICS protocol to another; this will facilitate ease of use by researchers and lead to the easier creation of security techniques and systems that function for many ICS protocols – not the single protocol supported by a testbed instance. For this reason, much of the specification of system behavior and characteristics should be maintained in text-based configuration files. Such files also promote usability and the ability to troubleshoot errors; this is especially true in comparison to the configuration methods for actual ICS systems that rely on buggy GUIs for configuration.

4.2 Components

The design of the virtual testbed is broken up into discrete components. The main components are the process simulator and the virtual device; other components include a module for analyzing packet captures and a module for logging and creating virtual serial ports (discussed in Section 4.4). Figure 4.1 shows how these components form a complete testbed. At the center of the diagram are virtual devices taking the places of MTU and RTU in an ICS system. These virtual devices may be replaced by real ICS equipment. Virtual devices may be connected using Ethernet links, wireless systems, or serial connections (using the PortLogger virtual serial ports). Virtual devices monitor and control a process simulated by the process simulator. Real HMI systems may be connected to the virtual devices.

All components were written in the Python programming language. Python is a dynamic, interpreted object-oriented language. This causes a performance penalty compared with other languages compiled to native machine code. In spite of this disadvantage, Python was used for four reasons. First, Python can be highly readable and promotes rapid development; this simplifies initial design and makes it easier for other researchers to learn the system and make modifications. Second, Python features extensive built-in libraries for user interfaces, logging, unit testing, scientific computing (used in verifying and visualizing the generated traces, and can be beneficial in process simulation), and even ICS protocols (including Modbus). Third, C code can be written as a Python module either manually or by using a toolkit like SWIG; this feature allows the use of already developed and tested ICS protocol libraries in the virtual testbed without having to write

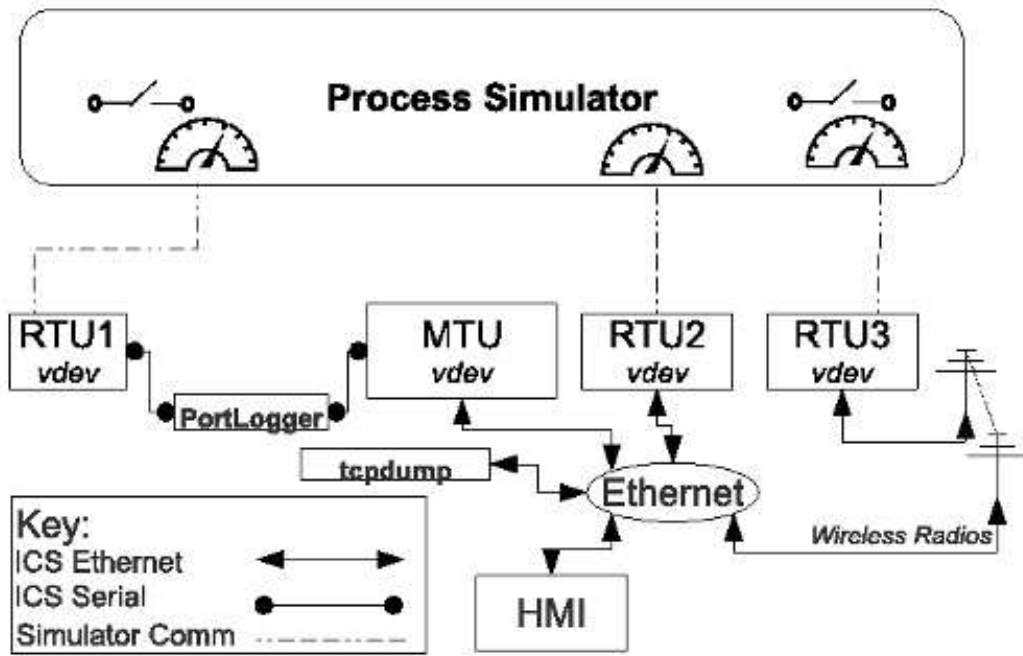


Figure 4.1

Testbed Architecture

an implementation from scratch. Finally, Python features like dynamic “duck-typing” and module and object introspection allow for simple yet powerful polymorphic interfaces, allowing components like protocol types to be interchanged seamlessly and specified from configuration files with little extra code.

Traditional network simulation toolkits, like NS-2, NS3, and OMNet++ were not used for several reasons. First, traditional network simulation toolkits feature a heavy burden in both design complexity and learning curve. For testbeds based on network simulation toolkits, not only does a new researcher in ICS security have to learn about ICS, he must also learn the toolkit. By eschewing the complexity of traditional toolkits, this project hopes to increase user-friendliness while not sacrificing performance relative to the goals discussed in the previous section. Second, traditional network simulation toolkits focus on providing detailed modeling of system behavior for performance optimization; this includes fine-grained modeling of queueing effects and myriad processing delays. By contrast, this project is concerned only with the level of detail required by ICS security researchers — not ICS network designers. Third, traditional network simulation toolkits focus primarily on TCP/IP and wireless networks, and many existing testbeds are also focused almost exclusively on TCP/IP ICS networks. This project aims to provide an emphasis on serial-communications-based systems while not neglecting TCP/IP ICS networks. Finally, traditional network simulation toolkits are designed to have the flexibility to model large network behaviors; by contrast, as most ICS systems number in merely tens of nodes, the complexity of being able to model large networks is not needed.

4.2.1 Process Simulator

The first component of the virtual testbed is the process simulator. The process simulator is meant to simulate and model the mechanics of a physical process being controlled by an ICS. For example, if a testbed were designed to model an oil storage tank, a process simulator would be necessary to manage the physics of filling the tank, including enabling the pumps and drain valves. Process simulators must simulate not only the physics of the system, but also be responsive to control inputs from the ICS (virtual or real), just as in a real ICS. For ICS security research, it is vital to be able to model the effects of attacks and countermeasures not just on the ICS equipment but on the actual process under control.

The virtual testbed process simulator is designed to communicate directly with some or all of the devices in the virtual testbed; this communication occurs on a “back channel” separate from the ICS communication. The communications consist of measurements from the simulator and inputs to the simulation from the devices. The data that comes from the simulator is meant to mimic the analog and digital inputs found in PLCs and other ICS devices used for temperature, pressure, flow, and other gauges. The data delivered to the simulator is meant to emulate the analog and digital outputs on ICS devices that are used to control actuators like motors, pumps, and valves. The process simulators are discussed in more detail in Chapter 5.

4.2.2 Virtual Devices

ICS consist of devices that make control decisions and implement those decisions in the system either directly by physical input or by communication to other devices. In

practice, these devices are often PLCs in ICS, or Relays, PMU and PDC in electric grid contexts. These devices are modeled in the virtual testbed by instances of “virtual devices” or vdevs. Vdevs communicate with the process simulators using secondary communications channels and other vdevs and real ICS devices via ICS protocols. As such, vdevs are the most critical components of the virtual testbed.

4.2.3 Configuration Files

Both the process simulator and the vdevs are highly modular, and system characteristics and behavior, apart from the process control logic and the process simulation, is described by a single configuration file. This file is text-based and can be hand-edited or machine-generated; the current implementation uses the ConfigObj Python module to read the file, and the file consists of data structures in Python object syntax. The file contents include simulator configuration information and configurations for each vdev in a system. Simulator configuration information includes simulator interface type, interface configuration information, and simulator variable initialization (what values should simulator variables start as). Vdev configuration information includes the number and names of each vdev in the system, the data objects to be stored (Points, discussed in Chapter 6), interface timeouts, ICS protocol types, ICS servers and clients protocol types and number, and ICS interface configurations (like addresses, ports, et cetera).

4.3 Use Cases

Although the virtual testbed was originally conceived with the limited goal of furthering IDS research, the choice to design the testbed in a modular manner and the fact that the testbed is designed to operate “live” in soft realtime greatly increases the ways that the virtual testbed can be used. This section outlines potential use cases of the virtual testbed by new ICS security researchers, veteran ICS security researchers, in ICS security education, and in industry.

Making the virtual testbed available free of charge will lower the barriers for researchers entering the ICS security area. New researchers will be able to conduct, at a minimum, preliminary work in ICS security before investing significant funds on a full ICS testbed. Because the virtual testbed can integrate with real equipment, researchers can perform security testing and evaluation of ICS equipment for device and protocol vulnerabilities with a full ICS, not merely a PLC or two. Researchers can design attacks against physical devices or against the virtual devices, as well as design countermeasures and test them in the virtual system as well. Lower barriers to entry may more research being done to improve the state of ICS security.

Veteran researchers who already have substantial investments in ICS testbeds can also benefit. First, researchers can “digitize” their existing testbeds and gain the benefits of virtual testbeds. Although the virtual systems would not serve to replace the physical testbed, researchers can gain many of the benefits of the digital system. These include low maintenance (virtual systems do not age, and can be restored from backups or version control systems), quick reconfigurability, and the ability to distribute the system among

their research group, collaborators, and the research community. In addition to being able to share their own testbeds, a veteran researcher will also be able to do research in virtual testbeds that are provided by others; this permits rapid testing of new ideas in a number of different systems. IDS researchers may use the virtual testbed to test IDS approaches in an ICS before moving to a hardware platform (this is especially relevant with serial systems).

The virtual testbeds can also be used for ICS security education and training. Already, ICS security is such a growing field that training in attack and defense is coming into demand. Private training firms may use the virtual testbeds in short courses to teach ICS exploitation and defense without having to resort to maintaining much physical equipment. Individuals may investigate ICS security by obtaining the virtual testbeds and studying individually or after a training course. Graduate courses in ICS security can use the testbeds for similar purposes or to encourage research projects that would be infeasible otherwise. Virtual testbeds may also be used in cyberdefense competitions or capture-the-flag exercises to add ICS security to the list of challenges.

Finally, the virtual testbed can be set up in corporate environments as a honeypot. Honeypots are networks or simulated networks of poorly secured computers that are not used by an organization, but serve as an attraction or distraction to attackers who cannot tell the difference from a production system. Honeypots are used both as a research tool to learn about attackers' methods and as a defensive measure to prevent an attacker from affecting critical systems and to discover the vulnerabilities that lead to the exploitation of the honeypot. Deploying a virtual testbed in an enterprise network would carry a low cost but may serve to improve an organization's ICS security posture.

4.4 Logging

As a main goal of the virtual testbed is the generation of useful datasets, an important consideration is just how exactly these datasets should be captured. Traffic capture, if done improperly, can lead to missing data or erroneous characteristics, like inaccurate timing. This section addresses techniques and tools that have been developed for creating captures using the virtual testbed. The following subsections describe preferred methods for obtaining traffic captures from TCP/IP ICS testbeds and actual systems.

4.4.1 TCP/IP Logging

Capturing TCP/IP network traffic is a common practice, and well-known tools and techniques exist. The main software tools for capturing network traffic are based on libpcap and include Wireshark and tcpdump. Obtaining captures of switched Ethernet networks (in actual ICS, for example) may entail configuring a SPAN port on a switch to mirror all traffic to the port that is being logged; in hubbed Ethernet networks this is not necessary. Multiple capture systems may be needed in large networks that are not connected at Layer 2; this includes systems with “air-gaps,” some LAN and virtual LAN configurations, including systems that contain firewalls.

Capturing traffic in a virtual system comes with different considerations. As each vdev is implemented as a single process, for testing purposes it is suitable to use Localhost as the address for all devices. However, to generate realistic traffic, each device should have its own IP address (likely in the same subnet). One approach would be to host each virtual device on a single workstation; a more practical approach would be to have each device

run in a virtual machine on a single host. This host can place all devices on a host-only virtual network from which traffic may be captured using tcpdump or Wireshark. This provides a separate network address to each device, and also makes it possible to keep simulator communications distinct from the rest of the testbed traffic and also the network traffic of the host machine.

4.4.2 Serial System Logging

While logging of TCP/IP systems is common, logging of serial communication systems is not. Additionally, no operating system natively supports an interface that is perfectly analogous to an Ethernet loopback interface for serial systems. Because of this, a Python program, PortLogger, was written to address these concerns for Linux systems. Specifically, PortLogger solves three problems:

1. Creation of virtual serial ports to connect multiple vdevs
2. Ability to connect multiple virtual ports to one or more physical serial ports on the machine
3. Log all data transmitted by serial devices (virtual or otherwise)

To create virtual serial ports that can be logged, PortLogger creates a pseudoterminal master/slave pair for each virtual device requiring a serial port; the slave port is provided for the device (or a symbolic link is created from the slave port to a file that the device expects to read), while the master port is opened by the PortLogger. When a device sends a message, it is read by the PortLogger, echoed to the other devices. and logged. The PortLogger can also open a physical serial port, and echo to and from it as if it were one of the pseudoterminals. It is also possible to designate a single device as a “Master” to

emulate a master-to-slaves multipoint RS-485 system. The PortLogger can also execute a delay between receiving a message and retransmitting it to emulate transmission delays.

When logging an actual ICS with no virtual components, especially to gather data for comparing a virtual testbed to an actual ICS, it is important not to modify or impede the flow of traffic. Logging techniques that place an active device between two devices to be measured — “bump-in-the-wire” systems — cannot be used to obtain traffic captures that contain timing information that reflect traffic conditions when the system is not being logged. Instead, serial tap cables should be used; these are cables used between to connect two serial devices that have additional connectors on each data line for a logger to listen to transmissions. The PortLogger may also be used for this purpose.

As there is no standard for serial system log files as there is with PCAP and TCP/IP networks, a log format specification is required. Currently, each PortLogger capture is a standard text file that holds a four-line header containing the start time, the ports being logged, a header that describes the file format, and a fourth line for optional comments. Each record is specified on its own line, and each record contains the Unix time the packet was received by the logger, the port it was sent from (virtual or otherwise), and the data of the packet. Each field in a record is separated by “ : ” — a space, a colon, and a space. Each byte of the data field is encoded as a two-character hexadecimal value to prevent binary data from being interpreted as file formatting marks. In the future, it may be necessary to use a more compact binary file representation; the Snoop format (RFC 1761) would be a good option as it is extensible, standards-based, and supported by common tools like Wireshark.

4.5 Testbed Systems

Two simulated systems have been created for the testbed, and both have been designed to match existing testbeds in the MSU laboratory. These are the laboratory-scale pipeline and ground tank. These systems are described in Subsection 2.2.1.

4.5.1 Pipeline

The pipeline virtual testbed is based on MSU's pipeline laboratory system. This system supports Modbus/RTU and Modbus/TCP ICS communications protocols. This testbed simulates a pipeline used for oil transportation. In the simulated system, there is a pump that creates pressure in the pipeline by pumping "oil" in, and a valve that releases the pressure by delivering oil. There is a single analog pressure sensor that indicates the pressure in the pipeline

The ICS of the pipeline consists of a master vdev and a slave vdev. The master vdev polls the slave for updates on pump status, valve status, pipeline pressure, and sets commands for PID setpoints, PID constants, control mode, control type, and manual settings for the pump and valve. The slave vdev reads the analog pressure value from the simulator and responds to requests from the Master units. The slave runs a PID algorithm to maintain the pressure at a constant setpoint based on parameters set by the master, and sets the pump and valve positions. The communications consist of a "read registers" request and response and a "write registers" request and response.

4.5.2 Ground Tank

The ground tank virtual testbed is based on MSU's ground tank laboratory system. This system supports Modbus/RTU and Modbus/TCP ICS communications protocols, and simulates a ground tank used for oil storage. There is a constant flow of fluid from the storage tank, with a pump to increase the level of fluid as requested. There is a single analog pressure sensor that indicates the fluid level in the tank. The ICS portion of the testbed consists of one master vdev and one slave vdev. The master vdev polls the slave for updates on pump status, water level, and sets commands for alarm levels, level setpoints, control mode, and pump on/off. The slave vdev reads the analog pressure value from the simulator and responds to requests from the Master units. The slave also provides the simulator with a value for turning the pump on and off. The slave also manages high and low alarm levels. The communications consist of a "read registers" request and response and a "write registers" request and response.

CHAPTER 5

PROCESS SIMULATORS

This chapter discusses the design of a process simulator for use in the virtual testbed. The process simulator is meant to simulate and model the mechanics of a physical process being controlled by an ICS, expressly for the purpose of providing the testbed devices a process to control. A number of commercial software systems that simulate ICS processes exist, and are used in industry for control design and operator training[51]. Commercial industrial process simulators are sophisticated, featureful, and designed to be able to simulate very complex processes. These systems are expensive to license and none are open-source or available free of cost. The virtual testbed process simulator is meant to be an open, free alternative to expensive industrial systems for the sole purpose of security research; it is not (nor was it designed to be) to the level of sophistication of industrial process simulators. The custom simulation framework in the virtual testbed may be replaced by one of these systems, if one is available to users of the testbed (this is discussed later).

Process simulators must maintain a faithful simulation of an industrial process in soft real time. Process simulators must provide measurements of the industrial process to the testbed in the form of “inputs” to the virtual devices. These inputs will depend on the physics and state of the simulation. Moreover, the simulation must respond to control from the virtual testbed from virtual device “outputs.” For example, if an electrical substation

is being modeled, a vdev throwing a breaker in the simulation should cause the associated bus current to go to zero. As another example, suppose a conveyor in a simulator is controlled by a motor's speed. If the motor speed is set by a controlling vdev to 0, the conveyor should stop, while if the speed is set to a value beyond the intended operation of the conveyor (but within the limits of the motor), the resulting process should be affected accordingly.

While the process of specifying a process simulation will always be domain-specific and require specialized knowledge, the simulator can ease this burden by specifying a simple framework for designing simulations. This was a goal that motivated the design of the simulator.

In the following sections, the design, and use of the simulation framework are discussed, followed by descriptions of the simulation systems already developed.

5.1 Design

The process simulator consists of four components: a simulator module that executes simulations, coordinates states, and sends and receives updates from virtual devices; individual simulation modules which represent the systems being modeled; the configuration files controlling the setup and execution information of the simulations; and the communications interfaces designed to facilitate simple modification of the communication medium between the simulator and the virtual devices. Essentially, the simulation framework separates the simulator, which executes the simulation and coordinates communications, with each process simulation. The simulation framework architecture is shown in Figure X.

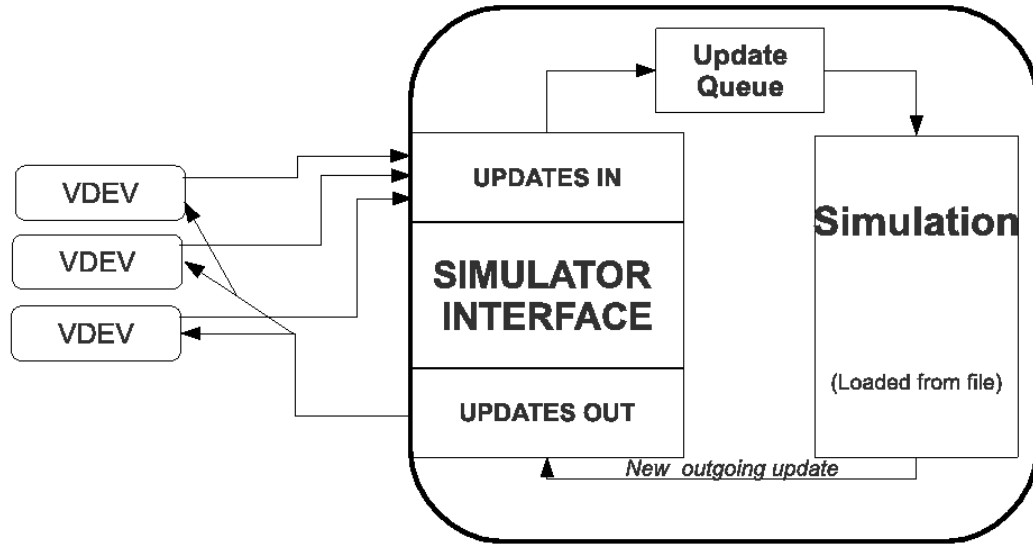


Figure 5.1

Simulator Architecture

Each process simulation exists as a Python class; a simulation class is imported by the simulator to run a particular simulation. Simulation classes have the responsibilities of reading the configuration file, setting the simulation into an initial state, and implementing the time-based simulation. The configuration file contains information about communications interfaces and can also contain important simulator constants, like flow rates or motor speeds, that a user might want to set or customize apart from the simulation. Process simulations are discrete-time based and is written in terms of the effects in the change of time since the last simulator iteration. Information about simulator state, including current measurements, inputs, outputs, and any relevant other data relevant to the simulation is maintained internally. Each simulation class must contain a `step()` method; the `step` method simulates the passage from the end of the last simulation second to the time given

in the argument “upto” to step(). The step() method uses the current state, the amount of time that has passed from the current time to the “upto” time, and models of the process to determine the next state of the simulation.

The simulator also is a Python module that runs as a single process. The simulator must handle not only stepping the simulation, but also constantly changing state variables from the outputs of the vdevs. The simulator process imports a specific simulation (based on a command line switch), initializes that simulation, and then enters the main control loop. The loop is executed when an update packet is received from a vdev, or when the wait times out, whichever occurs first. Each update contains the time at which the update was sent (and thus should take effect). When the simulator receives an update packet, it simulates up to the time that the packet should take effect, then the changes from the update are applied. This process continues until no more updates are left in the receive queue, and then the simulation is stepped to the current time. When the simulation is current, an update is compiled of the current state of the inputs to the vdevs and sent to the vdevs; there is a brief wait, and then the loop continues again. As updates arrive asynchronously to the simulator, and may affect intermediate simulation results, it is important that no update is ignored, but occurs at the correct time in the simulator. Because of the design used for this constraint, the simulator is in practice always slightly behind the current time. However, the amount of time between simulation runs and updates in practice is quite small (milliseconds or tens of milliseconds). The amount of time between runs may be controlled by the user to be much smaller than the value currently used; the larger

delays have not been shown to negatively impact performance, while shorter delays greatly increase the amount of processing required by the simulator.

The simulator interface accepts and provides updates to and from the simulator about relevant inputs and outputs of the device. The main logic of the simulator interface is written in just three functions: `processUpdate()`, `applyUpdate()`, and `compileUpdate()`. `processUpdate()` decodes an update message from the vdevs into a dictionary of (“Pointname”, “Value”) pairs of inputs from the simulator; `processUpdate()` is run when an update packet is received by the simulator, and the returned dictionary is placed on the update queue. `applyUpdate()` takes this dictionary as a parameter and for sets the value of each updated point to the value from the update packet; `applyUpdate()` is called once for each update packet. `compileUpdate()` creates an update of the output points to send back to the vdevs. Presently, updates are encoded using JavaScript Object Notation (JSON). JSON encodes data objects as strings formatted as Javascript object literals. JSON representations may be contain associative arrays, lists, strings, numerals, booleans, and nulls. Lists and associative arrays may be hold any type of JSON data, including lists and associative arrays. JSON was selected because it is supported by many standard libraries in many languages, is sufficiently flexible that changing simulation semantics and variable names and types requires no reconfiguration of the encoding (as a fixed binary format would), and as a plaintext format, it is easy to debug and can be written easily by humans. The commercial process simulators discussed in Chapter 5 likely will have their own data interchange formats. For these reasons, the simulator interface may need to support other protocol formats. To add new support for simulator interfaces, only the three functions: proces-

sUpdate(), applyUpdate() , and compileUpdate() will need to be overridden to perform the corresponding tasks for whatever protocol formats are added to the testbed.

Currently, simulator updates are sent and received using UDP/IP datagrams. UDP offers low overhead and can be used when the virtual devices and the simulator are all run on a single host, on virtual machine hosts, or multiple distributed hosts. However, a Python module, ifaces.py, was created to provide a network-agnostic communications interface for simulator messaging so that simulator messaging can be extended to use TCP/IP, unix pipes, serial ports, or other communications methods. A base class specifies initialize(), sendMessage(), getMessage(), and shutdown() methods that create and open the connection, send update messages, receive update messages, and close the connections, respectively. The ifaces classes are also used to provide multicast communications by specifying a list of recipients for sendMessage; this simplifies sending simulator updates to many virtual devices.

5.2 Simulated Systems

Simulations have been implemented for the ground tank and pipeline systems described in Section 4.5. This section shows the main variables of the simulations in comparison with the laboratory systems.

Figures 5.2, 5.3 and 5.4 shows the ground tank levels under simulation and in the laboratory. Subfigure 5.2 shows the laboratory and virtual systems set in manual mode to increase from minimum to full level; this figure shows that the change in level in the two systems is nearly identical. Subfigure 5.2 is the opposite of the previous figure and shows

the laboratory and virtual systems set in manual mode to decrease from full to minimum level; this figure also shows that the change in level in the two systems is nearly identical. Subfigure 5.4 shows the two systems starting from empty, being placed into auto mode, and then turned off after several pump cycles. In this example, the virtual system was allowed to run for more cycles than the laboratory system; however, the behavior of both systems is similar.

Figure 5.4 shows the pipeline system pressures in the virtual and laboratory systems in auto mode. The graph shows that a greater pressure variation is seen around the setpoint in the laboratory than in the virtual system; this is due to a mechanical switching delay in the valve solenoid that is not modeled in the simulation. In spite of this difference, the behavior of the two systems is largely the same.

5.3 How to create a new simulation

This section details creating a new process simulation for a testbed. Creating a simulation entails creating a new simulation class. This class should contain a constructor that reads configuration information from the configuration file, stores relevant simulation parameters, and instantiates and initializes the communications interface. The configuration file should include information about what type of interface to use to communicate with the virtual devices and interface parameters like addresses or ports. The configuration may also include simulation information like motor speeds and torques, tanks sizes, or any other parameter that may be useful for a user to customize. The simulation class must also implement a `step()` function; helper functions to aid in modeling the physical system may

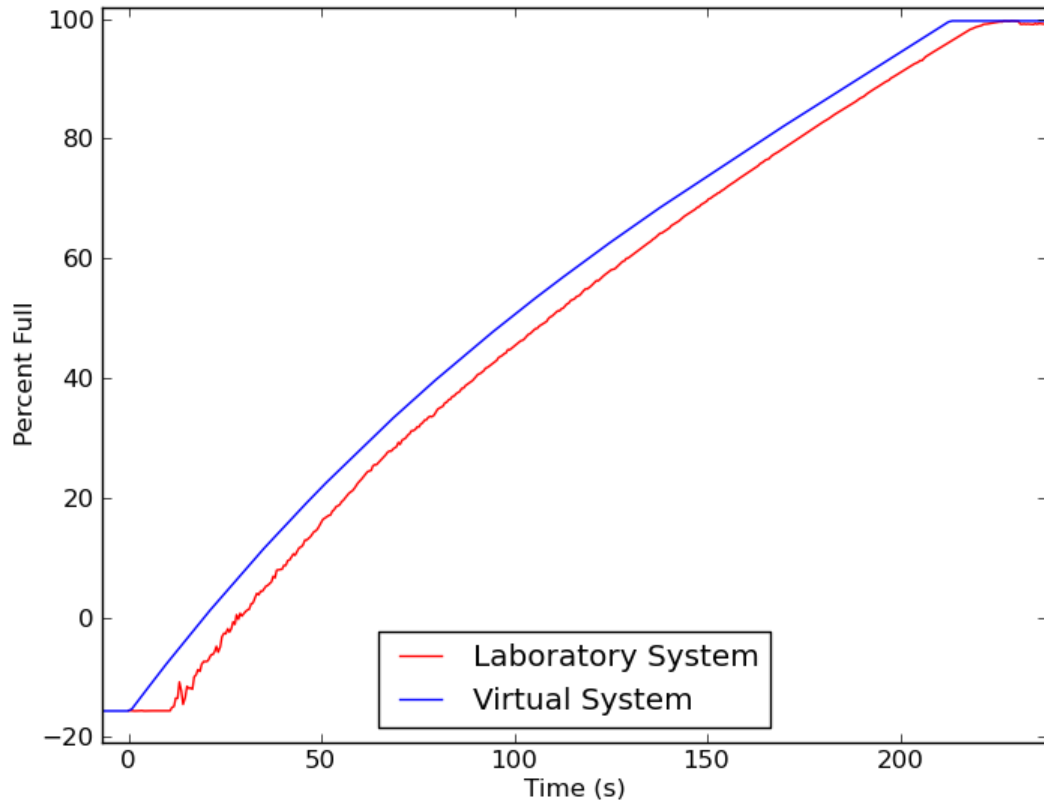


Figure 5.2

Ground Tank Empty to Full

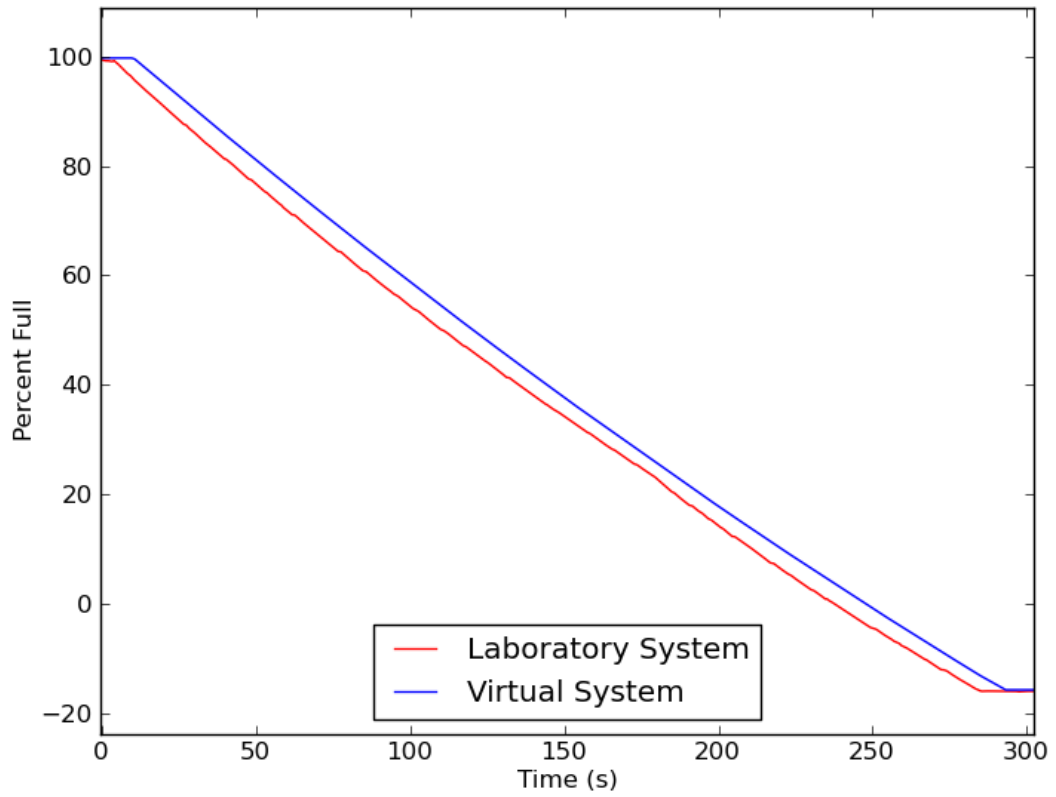


Figure 5.3

Ground Tank Full to Empty

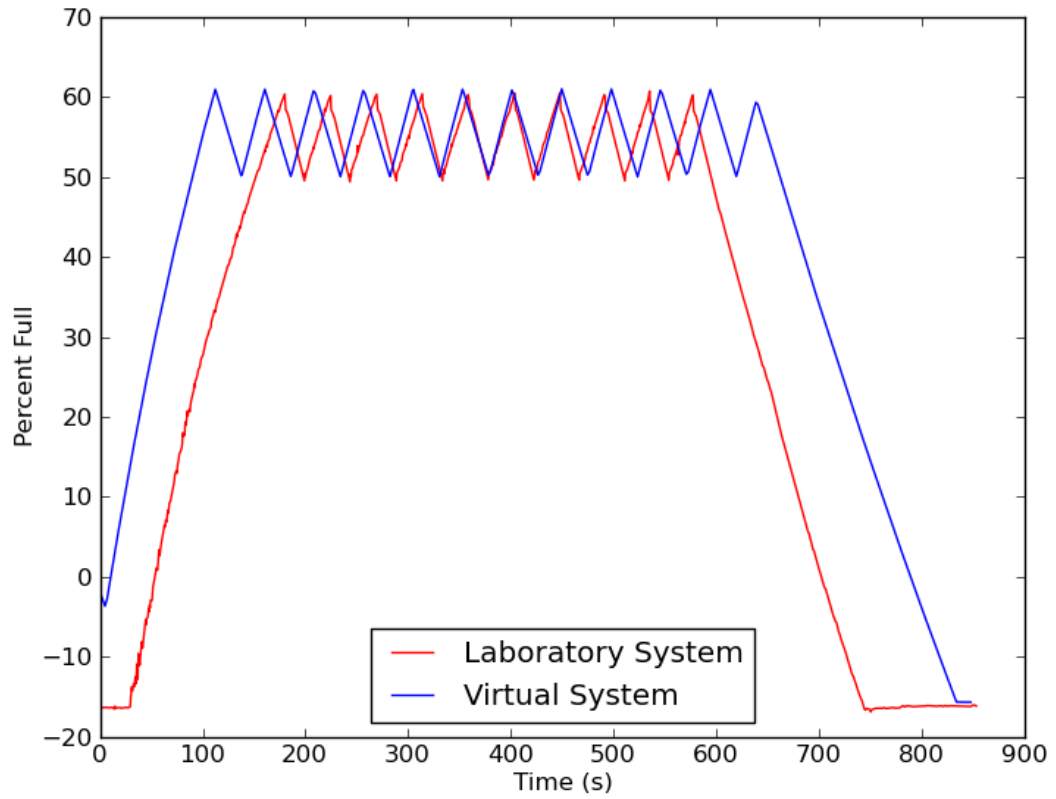


Figure 5.4

Ground Tank Simulation Comparisons: Ground Tank Auto Mode

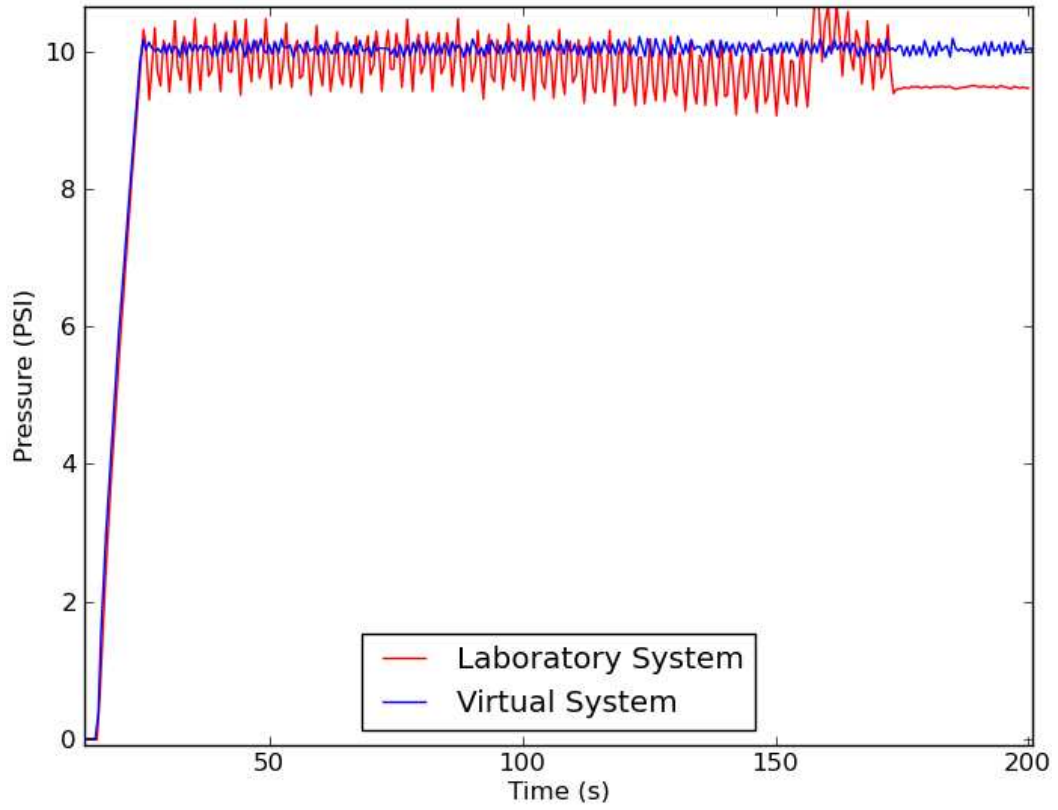


Figure 5.5

Pressures of Pipeline Systems in Auto Mode

be written as necessary. The `step()` function should return the state of the process at the “upto” time, based on the simulator’s current state and the current inputs to the simulation. While each system will present its own challenges in defining faithful simulations, this process of writing the `step()` method will typically entail defining equations that govern the system as a function of time; these will most often be based on the physics of the system to be controlled. Python mathematical toolkits, like NumPy or Sage, may be useful for in defining and solving these equations — especially systems governed by differential equations. It may be desirable for security research to not only describe normal operating states, but also failure states, such as a motor overheating or a tank rupturing — especially if these failure states could be caused by certain control actions. This allows for attacks to be tested and captured that would be inadvisable in real ICS or laboratory scale ICS due to the damage that would be caused.

CHAPTER 6

VIRTUAL ICS DEVICES

This chapter details the virtual devices, termed “vdevs,” that are the primary components of the virtual testbed. The purpose of the vdev is to emulate the behavior of ICS devices like programmable logic controllers and electric grid relays. Vdevs interface with simulators (in the same manner that the actual ICS devices interface with the physical process under control), and they also communicate with other vdevs and actual ICS devices using ICS protocols. Vdevs must be able to handle all of the logical tasks expected of an ICS device. This includes reading inputs, writing outputs, and processing control logic. This also includes communication with other ICS devices. One notable goal specific to this testbed project is that it should be possible to change system aspects like communications protocols by only changing the configuration file (virtual testbed configuration files are discussed in Subsection 4.2.3) — vdev logic and other characteristics should be unaffected. This is a functionality above what is typically provided by ICS systems, and it motivates abstractions between protocols, data, and logic. Typically, ICS data stored in actual devices is described in terms of a particular protocol’s data model – not independently of it. For example, PLCs that use Modbus as a primary communications method will denote data to be stored in 16-bit “registers,” and that data will be referred to unambiguously by the Modbus-style register address. This is a hindrance to being able to

describe system logic independent of protocol. For this reason, device logic and behavior is described in terms of the data to be stored; discrete data items like individual measurements, calculations, or setpoints are all stored as individual objects termed “Points” in the virtual testbed. Other tasks often performed by an ICS device include acting as FTP or HTTP servers. This functionality is not provided natively in the vdev itself. However, the functionality may be emulated by running an FTP or HTTP server alongside the vdev in a virtual machine. Other services may also leverage Python’s extensive library to implement a server if required; modules are available for FTP and HTTP.

The following sections discuss the design of the vdev and what is required to implement a new vdev instance.

6.1 Design

The vdev is implemented as a Python module. An instance of a vdev runs as a single multi-threaded process that acts as a single PLC or other intelligent device in the virtual testbed. Many such instances can be run to populate a testbed; they may be executed inside a single or multiple virtual machines, a single PC, or on distributed PCs. Vdev behavior is determined at runtime by command line switches to indicate which system and which device should be run; these command line switches are interpreted in terms of the configuration file for the testbed. A vdev holds a certain number of “points.” Points are data objects that are held by the virtual device; point objects represent data that would be measured or stored by an actual physical device. Each vdev instance executes a user-defined process control function that reads the current values of the points, sets new values as ap-

appropriate to modify the execution of the process. Each execution of the program is termed, as in PLC terminology, a “scan”. Vdevs also implement 0 or more ICS protocol clients, which request information from other devices, ICS servers, which respond to requests from ICS clients, and simulator interfaces which exchange information about the status of virtual inputs and outputs. Figure 6.1 shows a diagram of the virtual device architecture.

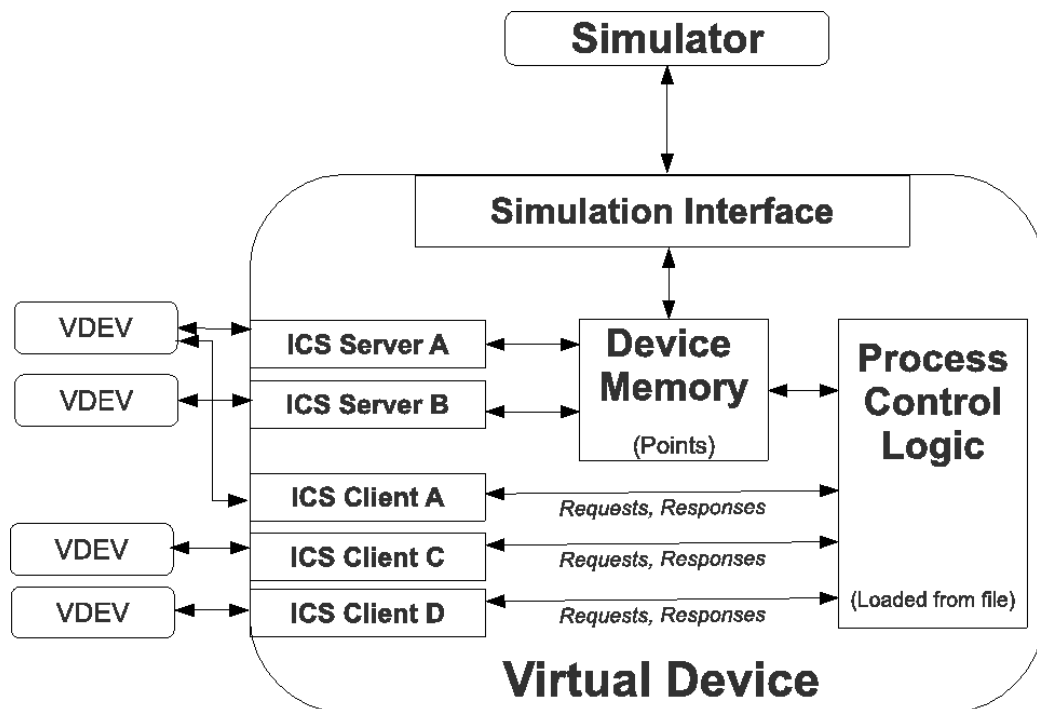


Figure 6.1

Virtual Device Architecture

6.1.1 Points

Points are data objects that are held by the PLC. The point class was created to create a protocol-agnostic interface and nomenclature for data objects. This allows ICS clients,

servers, and process logic to refer to the same data objects as protocol dynamics and memory models change without having to modify any code — only the configuration descriptions. These points may hold a value of any data type — integer, string, floating point, binary file object, or even a Python class. This is made simple by Python’s dynamic type system.

There are three types of points (determined by a member variable of the Point instance): inputs, outputs, and internal points. Inputs are points whose values are determined externally by the process simulator or another vdev. Output points are points whose values are computed or set by a vdev and shared with other vdevs or the simulator. Internal points are meant to store state variables, intermediate values of calculations, or any other data that does not come directly from other parts of the testbed or is shared outside a particular vdev. These classifications are used for determining how the vdev handles certain points (like sending out updates to the simulator) but are not strictly enforced. Each point instance is unique to a virtual device, and is specified and designated as a dictionary in a list of vdev points in the configuration file. When a vdev is started, this list of point descriptions is read and a list of corresponding Point objects is created. Points are represented uniquely throughout the vdev by a “name” string; this name must be unique to each point in a vdev. The point description contains metadata for each protocol that a given device in a virtual testbed supports; the metadata holds protocol-specific information. In the case of Modbus, this includes the register address, the block type, and the data type, and any fields required by the underlying protocol layer.

An example point description is `{ 'name': 'LevelRawInputReg', 'typ': 1, 'value': 3563, 'metadata': { 'modbus': { 'addr': 0, 'blockname': 'inputreg', 'blocktype': 4, 'datatype': 'uint' } } }`. This string describes a Point used for vdev input (meaning the value comes from the simulator). The name of the point is “LevelRawInputReg,” its initial value is 3563, and the Modbus metadata that indicates that it is an input register of address 0 of unsigned integer type. Every aspect of the point description is read and stored into the Point object it describes, so the information is accessible at all times.

Points may be referenced directly, or by `PointView` objects. `PointView` objects may be used when a modified representation of a Point object is needed, but if the modified representation is written to, the referenced Point object also changes. One example use of a `PointView` object is to express 32-bit floating point values in 16-bit chunks to satisfy the memory model of Modbus. For example, if the lower 16-bits of a floating point register are written by a Modbus Write command, the point value should change accordingly; `PointView` objects simplify this behavior. Point objects also support callbacks when set for logging, value testing, or other purposes. Writing the list of points can be cumbersome for large numbers of points; a useful technique is to create a spreadsheet containing all points and their individual parameters and generate the point description from the spreadsheet values.

6.1.2 Control Logic

The control logic is meant to directly emulate the control and monitoring functions of an ICS device. Control logic is specified as a single Python function separate from the vdev implementation; the control logic is loaded at runtime. The control logic is called at specified time by a logic control thread; this thread also synchronizes simulator communication (see the next subsection for details). The same control logic function may be used for multiple slave devices to allow code reuse. Process control logic in actual ICS systems consists of reading inputs and setting appropriate outputs. For example, a PLC may turn on a pump when a measured pressure reaches a low value. This type of behavior is accomplished when the control logic reads the values of vdev points (especially inputs) and writes new output values to affect the state of other devices and the simulated process.

The following Python code is an example of a section of process control logic from the Ground Tank virtual testbed. This code checks the points covering system mode, the level setpoints (high and low), and the current status of the pump to determine whether to turn a pump on or off. It is important to note that this code is entirely protocol independent — there is no mention of addressing or point types. It is possible to check those features as they are accessible through the Point objects themselves if necessary; an example is that it may be easier to describe a large group of Points objects by consecutive addresses in one protocol, but the same work will be done on those points regardless of ICS protocol in use. When referencing some aspect of a point's protocol-particular metadata, the same behavior for different protocols will still be achieved as the metadata stored in the point is constant and does not change based on protocol usage; so code that selects a group of

points by a Modbus address will select the same points even if the vdev is only being used to serve DNP3 data at a later time.

```
# Determine if pump should be turned on  
if (points['SystemInAUTO'].get() and  
    not points['HighLevelFloat'].get() and  
    (points['LowLevelFloat'].get()  
    or points['PumpRunCmd'].get() )):  
    points['PumpRunCmd'].set(True)  
elif (points['SystemInMAN'].get() and  
    points['MANPumpRunCmd'].get()):  
    points['PumpRunCmd'].set(True)  
else:  
    points['PumpRunCmd'].set(False)
```

Figure 6.2

Sample Process Control Logic

6.1.3 Simulator interface

The simulator interface accepts and provides updates to and from the simulator about relevant inputs and outputs of the device. The simulator client receives update messages and is run in a thread in the vdev process; received messages are processed and placed on a queue to be applied at a later time. The logic of the simulator interface is written in just three functions: processUpdate(), applyUpdate(), and compileUpdate(). processUpdate() decodes an update message from the simulator into a dictionary of (“Pointname”, “Value”) pairs of inputs from the simulator; processUpdate() is run when an update packet

is received by the simulator, and the returned dictionary is placed on the update queue. `applyUpdate()` takes this dictionary as a parameter and sets the value of each updated point to the value from the update packet; `applyUpdate()` is called once for each update packet. `compileUpdate()` creates an update of the output points to send back to the simulator. After each individual update is applied, the process control logic is run, and then `compileUpdate()` is run to create an update that is sent back to the simulator.

Currently, the format used for the simulator interface is Javascript Object Notation (JSON). JSON encodes data objects as strings formatted as Javascript object literals. JSON representations may be contain associative arrays, lists, strings, numerals, booleans, and nulls. Lists and associative arrays may be hold any type of JSON data, including lists and associative arrays.

As JSON is a text-based format, it is simple for humans to interpret and write; this aids in debugging the simulator communications. However, if large numbers of points were being exchanged between vdevs and the simulator, this format may become a bottleneck. Also, the commercial process simulators discussed in Chapter 5 likely will have their own data interchange formats. For these reasons, the simulator interface may need to support other protocol formats. To add new support for simulator interfaces, only the three functions: `processUpdate()`, `applyUpdate()` , and `compileUpdate()` will need to be overridden to perform the corresponding tasks for whatever protocol formats are added to the testbed.

6.1.4 ICS protocol interfaces

Industrial Control System protocol interfaces communicate between vdevs and other ICS devices using actual industrial control system protocols. These interfaces create the network traffic that the vdev is designed to generate. Although the terminology is not necessarily used in all ICS protocols, all protocols can be thought of as client-server systems. Clients can be loosely defined as devices that poll other devices for information, while slaves are devices that provide that information. The use of a client-server paradigm simplifies the design and use cases of the interfaces for the vdevs because clients and servers can be implemented independently. This is helpful, as some vdevs may be clients, some may be servers, and some may be both a client and a server.

For implementing the protocol interfaces in the virtual testbed, two Python modules were created: `ics_clients` and `ics_servers`; these modules are meant to contain implementations of protocol clients and servers, respectively. These implementations may wrap existing Python libraries, be created from Python bindings to already written code in other languages (like C or Java, if Jython is used), or be designed from scratch. Base client and server classes were written to outline the software interface of the clients and servers for new protocol implementations; actual protocol clients and servers can override the methods from these base classes. If uniform methods are used for client and server interfaces, protocols can be changed without having to change virtual device logic. Switching from one protocol to another can be done by instantiating a different ICS interface Client/server type, and the change will be invisible to the rest of the vdev. For this reason, client and server base classes were written with certain attributes and methods that are common to

all protocols. All protocol interfaces assume they will be connected to actual communications ports; this may be a network connection or a serial device. For testbed use cases where external connections to other vdevs on other hosts or to actual devices are necessary, this assumption is helpful; if only internal connections to other vdevs are required, virtual networks (enabled by virtual machines as vdev hosts) or virtual serial ports can be used.

The ICS Server base class requires four methods to be implemented: `__init__()`, `start()`, `stop()`, and `exit()`. These methods names were chosen to be compatible with their counterparts in Python's `Thread` class; this design choice allows for management of any ICS server as if it were a single thread. While all ICS Servers will contain at least one thread, some may contain more than one thread, and in any case it is helpful to isolate the particular protocol's thread details from higher levels of the testbed system. The `__init__()` method in Python takes the role of a class constructor and initializer; this method should initialize an ICS server based on protocol configuration information from the configuration file such that the server can be run by calling `start()`; this may include creating protocol library objects, threads, or logging. `start()` should start whatever threads are necessary for the server instance to respond to requests; `stop()` should safely shutdown the server object. `exit()` calls the `stop()` method, and is meant to be compatible with the methods of `Thread` objects.

The ICS Client base class requires three methods to be implemented: `__init__()`, `read_points()`, and `write_points()`. ICS Clients, unlike ICS Servers, generally are not threaded; rather, requests are initiated by the process control logic, which blocks to await a response. To promote protocol generality, the two basic operations that all protocols sup-

port are reading points and writing points, irrespective of point type or protocol. `read_points()` takes a list of points (named for the points on the *server*), and the values read are returned as a tuple in order corresponding to the list of points requested; `write_points` takes a list of points and a corresponding list of values those points should be set to and does not return a value. It is the responsibility of child classes to take the list of points (along with the values to be written in the `write_points()` case), parse them according to protocol metadata, and create suitable requests. Additionally, a client instance is created for each possible server connection; these client instances are passed in a dictionary keyed by the slave name to the process control logic.

6.1.4.1 Modbus Implementation

Two protocol interfaces have been implemented: Modbus/RTU and Modbus/TCP. Both were created by patching and wrapping the Modbus-TK Python Modbus library. Modbus-TK was chosen over a competing Python library PyModbus because Modbus-TK was more stable and had fewer bugs, although PyModbus promised more features (like more extensible function codes). Modbus-TK was chosen over integrating other libraries from C for ease of rapid prototyping. Modbus-TK, like many Modbus libraries, implements Modbus clients and servers separately. Also like other Modbus libraries, Modbus-TK maintains its own store of memory addresses corresponding to the data stored by the Modbus device; by default, these are independent of any other data storage mechanism. In order for the requests and responses to contain values consistent with the data from the rest of the vdev, the Modbus-TK datastores must be updated anytime a Point value

changes in the vdev. Rather than having consistency checks any time a request or response is received, or a point value changes, the Modbus-TK library was patched to store not only values but references to PointView objects. When a value is read from a datastore address by the Modbus-TK clients or servers, if a PointView reference is stored in that address, the value of the PointView is read. If that address is written by a Modbus write request, the PointView object is written, and the Point value corresponding to the PointView changes accordingly. The Modbus-TK library was also patched to change read behavior to match that of MSU's laboratory PLCs. The laboratory PLCs ignore serial port data until they see the expected address of a Modbus packet, then they attempt to parse the rest of the serial port data for the length of the expected packet; the Modbus-TK library was patched so that when a request or response is being received, the same behavior as the laboratory PLC occurs.

Because the Modbus-TK library uses the same interfaces for RTU and TCP clients and servers, Modbus child classes of ICSSClient and ICSServer were created to share code that would be common to both TCP and RTU systems. ModbusTCP and ModbusRTU clients and servers subclass from the generic Modbus class. Both the ModbusTCP and ModbusRTU Server classes implement one method: `_make_server()`; this method instantiates the appropriate server from Modbus-TK. Likewise, both the ModbusTCP and ModbusRTU Client classes implement one method, `_make_client()`, that instantiates a Modbus-TK client.

Modbus-TK handles server threading automatically; this means that the primary job of the server class is to set up the server, start it, and stop it. A key part of setting up the

server is creating the Modbus-TK datastore. The datastore indicates the memory model used by this server, or more precisely, slave instance; the memory model determines the types and addresses of Modbus coils, digital inputs, holding registers, and analog inputs that are present in a given slave. Because the memory model changes from device to device, memory models are written into the ModbusServer class; the memory model used in a device in the system is specified in the testbed configuration file. Two memory models are provided: a test memory model and a memory model that represents Control Microsystems PLCs. When the datastore is created, any points are also placed into their respective Modbus addresses in the datastore.

Modbus-TK clients have the chief responsibility of taking a list of points and (sometimes) values and forming reasonable requests from them. Because a user may write in the program logic to request variables of many different types or disparate addresses at once, the request logic must take the list of points given, group them by register type and address, and then send requests that read or write the most contiguous addresses at a time. Request grouping is done because Modbus reads and writes can work on multiple contiguous addresses at once. For read requests, if two points are less than or equal to five registers apart, a single read request will be generated for both of them; the extra values that are read are discarded. In the case of write requests, two addresses must be consecutive for values to be written, otherwise the registers in between the two points to be written will be overwritten with zeros. Once a read request is sent, the appropriate response values are paired with the points that prompted the request, and then returned.

6.2 Implementing a vdev

This section discusses the process of implementing a vdev. The steps include establishing writing the vdev configurations and writing the device logic. Before writing configurations or device logic, the role of the system must be planned. To determine the vdev's role, knowledge of the ICS network connections is required. Specifically, this entails determining how many clients and servers of which protocols will be necessary for the vdev; this also includes determining the physical layer interfaces, like serial ports or networks. Also important in to the role of a vdev is the inputs and outputs to the simulator. Also, how the vdev will control and interact with the process and other devices should be carefully considered.

The configuration for a vdev consists of ICS protocol interface information, simulator interface information, and point information. ICS protocol information consists of lists of server interfaces and client interfaces. Each entry in this list, which should contain protocol type and relevant information like ports or addresses, creates an interface. Simulator interface information is similar. First in creating the points list is to determine the simulator outputs and inputs to the system and account for them in the points list. Second is to determine the values that will be read and written by other devices. Third, auxiliary points must be identified; these are points used to store state or intermediate calculations. If replicating an existing system, creating the points list requires only duplicating the points from the actual system, and ensuring that the metadata (including type) is similar.

The process control logic is the implementation of how inputs to the vdev affect its outputs. As such, all possible inputs and outputs should be accounted for in the vdev —

even those that are unexpected. Additionally, the process control logic determines when ICS clients should send requests inside (or separate from) the control scheme. If replicating an existing system, logic should be “translated” faithfully from the native device format into Python.

CHAPTER 7

EVALUATION

Chapter 1 outlined the hypothesis to be tested in this thesis. It is repeated here:

It possible to:

1. Create a virtual testbed framework using Python to create discrete testbed components
2. that is designed such that the testbeds are interoperable with real ICS devices and
3. that virtual testbeds can provide comparable (within 90% similarity) ICS network behavior to a laboratory testbed.

The first clause is effectively evaluated by the design description presented in Chapters 4, 5, and 6 and the implementation of the testbed. The second and third clauses are evaluated in this chapter. Section 7.1 describes how the testbed is interoperable with ICS devices, affirming clause two. Testing clause three is less straightforward than clause two because verifying “comparable” network behavior has no bounded requirements. Ensuring interoperability involves simply connecting systems and verifying behavior, but there have been no published requirements as to what characteristics are required by the research community out of a virtual testbed. In fact, interoperability ensures a certain amount of guarantee as to the similarity of performance of the virtual testbed to a laboratory system. A second important criteria for a virtual security testbed is the ability of the testbed to exhibit similar behavior to ICS attacks; this is evaluated in Section 7.2. Finally, to quantitatively compare the virtual testbed network traffic to the laboratory testbeds, numerical

similarity scores were developed for key behaviors. Because there are no established quantitative guidelines for virtual testbed similarity, a “best-guess” approach was taken — the virtual systems should aim for 90% similarity metrics as a starting point. This value was chosen arbitrarily, and if researchers need a higher-fidelity testbed, they may take advantage of the openness of the testbed to work to improve these metrics. These quantitative comparisons are developed and results are provided in Section 7.3. In the case of both systems, a majority of the metrics meet the stated goal. This chapter deals mainly with network behavior; for a discussion of process simulation similarity, see Section 5.2.

7.1 Virtual Testbed Integration with Actual ICS Devices

This section details how the virtual testbed has been integrated with ICS equipment and communications devices. Specifically, the virtual testbed devices have been connected to each other not through virtual serial ports, but physical serial ports connected to ICS radio equipment. Using these radios, virtual masters have been paired with laboratory slaves, and laboratory masters have controlled virtual slave devices.

7.1.1 Integration with ICS Radio

The virtual testbeds have been integrated with ICS radios to prove interoperability with ICS communications equipment, as well as to show that the virtual testbed can be used to test ICS equipment for vulnerabilities (discussed in the next section). The radios used are the proprietary radio system discussed in Chapter 3. The radios were connected to a USB serial port device to the virtual testbed host machine. Each of the virtual devices in

both virtual testbeds were connected to individual PortLogger instances; each instance was connected to one serial port and created a pseudoterminal that a virtual device connected to. Essentially, the PortLogger was acting as a virtual “bump-in-the-wire” logger for both physical serial ports. Naturally, both logs will contain duplicate entries; however, both are required to have a constant amount of delay for both systems and to not generate imbalanced traces where one device appears much faster than the other. In analysis, the two logs are combined by taking the *received* packets from each log and placing them in a new trace according to timestamp order. Laboratory system traffic was taken using serial tap cables placed between each PLC and radio, and only received packets were logged. Figure 7.1 shows how the virtual devices were connected to the radios.

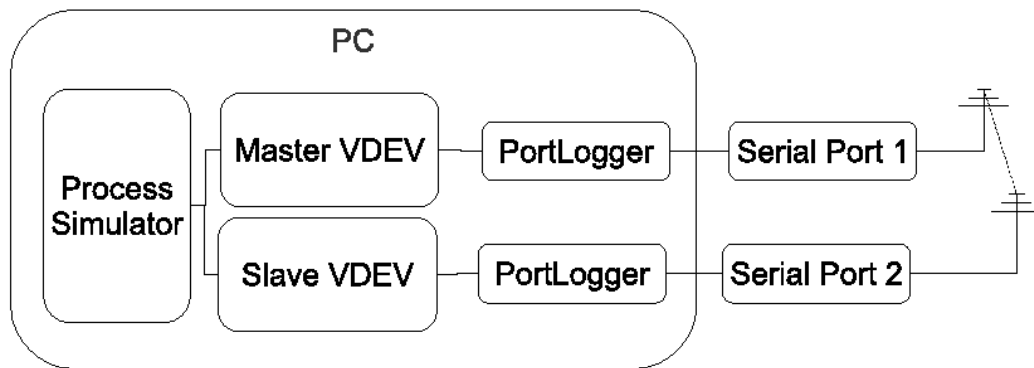


Figure 7.1

Virtual Device Radio Integration Testing

Tables 7.1 and 7.2 show similarity metrics¹ comparing the virtual and laboratory ground tank systems in off and auto mode. The auto mode laboratory capture contains 2248 packets sent over 599 seconds, while the auto mode virtual capture contains 2195 packets sent over 1081 seconds. The off mode laboratory capture contains 2789 packets sent in 715 seconds, while the virtual capture of that system in off mode contains 2142 packets sent over 1052 seconds.

Table 7.1

Similarity Metrics for Ground Tank (Off) Connected with Radios

Name	Similarity	Average Error	Max. Error	Percent Error
Byte Frequency	0.06950	0.00153	0.09771	0.000%
Byte Throughput	0.68553	32.68104	32.68104	-47.847%
Error Count	1.00000	-	-	-
Function Code Count	0.99997	0.00003	0.00029	0.000%
Function Code Sequence	0.99962	-	-	-
ID Sequence	0.99995	-	-	-
Interarrival Time	0.70904	0.23520	0.38586	91.694%
Invalid CRC	0.00000	-	-	-
Master-Master Interarrival Time	0.68438	0.47050	0.83835	91.781%
Master-Slave Interarrival Time	0.78333	0.10551	0.25558	54.811%
Packet Size	0.99976	0.00864	8.50000	-0.037%
Packet Throughput	0.68570	1.86614	1.86614	-47.828%

As in the results subsection, the byte frequency metric is low, and for the same reasons discussed in 7.3: namely, certain (arguably irrelevant) values were not simulated. In off mode, the actual system had one packet with a CRC error, but the virtual system did not; this leads to a similarity score of 0. All other non-timing behavioral metrics, including error count, function code count and sequence, and ID sequence, and packet size, are

¹See Section 7.3 for a discussion of the meaning of these metrics.

Table 7.2

Similarity Metrics for Ground Tank (Auto) Connected with Radios

Name	Similarity	Average Error	Max. Error	Percent Error
Byte Frequency	0.76628	0.00086	0.05964	0.000%
Byte Throughput	0.70183	30.17597	30.17597	-45.937%
Error Count	1.00000	-	-	-
Function Code Count	0.99995	0.00005	0.00046	0.000%
Function Code Sequence	0.99955	-	-	-
ID Sequence	0.99999	-	-	-
Interarrival Time	0.72192	0.22645	0.37763	84.962%
Invalid CRC	1.00000	-	-	-
Master-Master Interarrival Time	0.69990	0.45313	0.47920	85.022%
Master-Slave Interarrival Time	0.94038	0.04079	0.16559	-11.936%
Packet Size	0.99998	0.00091	2.00000	-0.005%
Packet Throughput	0.70185	1.72424	1.72424	-45.934%

still very high after radio integration. The timing metrics, which range from .68 to .78 in the two comparisons, are not as high as the other behavioral metrics. This is likely due to three reasons. First, the lab system used non-latency inducing taps for logging, while the simulated system used two PortLoggers which act as store-forward loggers. The method of logging likely skewed the timing results of the simulated system. Second, the virtual system was connected using a USB to Serial adapter for two ports; this likely added some transmission time delay. Third, the virtual system was still calibrated for use with a PortLogger, which may have also negatively affected the results by adding delay where it may not have been necessary. In spite of the low similarities in timing (which can probably be accounted for with additional calibration), the results show that all non-timing-based behaviors of the virtual system were similar to the laboratory system. The significance of this conclusion for an ICS researcher is that in this case, implementing or testing projects (like IDS) that depend heavily on timing characteristics with this setup

may lead to erroneous behavior or inconclusive results. However, results from projects not relying on timing can probably be trusted.

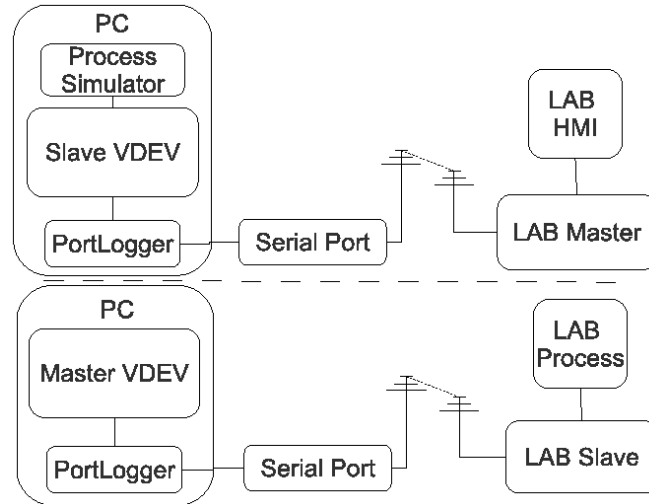


Figure 7.2

Real Device Interoperability Test Setups

7.1.2 Integrating a Virtual Devices with Actual Devices

In addition to connecting only virtual devices with ICS radios, it is possible to connect virtual devices with actual laboratory devices. Both connecting a virtual master to a laboratory slave and connecting a laboratory master to a virtual slave were tested with the pipeline system and found to be interoperable. The devices were connected through the ICS radios discussed in the previous subsection. Figure 7.2 shows the test setups.

In testing, the virtual master was able to control and monitor the real slave device to run the process. Also, the real master was able to do the same to the virtual slave; the

real master was able to read simulated process values from the slave. All system operation modes were tested and were functional, and there were no error communications errors present in the system.

7.2 Virtual Testbed under Attack

This section details attacks performed against the testbed to verify that the testbed can be used for testing attacks, not only generating “normal” ICS traffic. This quality is essential if the virtual testbed is to be used for security research. Three attacks are presented. The first attack is a response injection attack written by Wei Gao [33] and used with permission. The remaining two are attacks against an ICS using vulnerabilities in the ICS proprietary wireless system discussed in detail in Chapter 3.

The first attack assumes that an insider or other attacker with physical access has placed a device on the serial line between the master and slave device in the ground tank system; this device can monitor communications and inject commands and responses. For this test, the attacking device injects a predetermined response to the master read request once every second; this response states that the tank level is 22.3%. This attack is termed a “One Hertz Injection Attack” , and this attack was performed on both the laboratory and the virtual systems.

To accurately emulate this scenario in the laboratory, both master and slave were connected to the host machine via USB serial ports; on the host machine, a PortLogger connected each serial port to a third PortLogger (acting in store forward mode). In the virtual system, a similar set up was used, except the first two PortLoggers connected only to pseu-

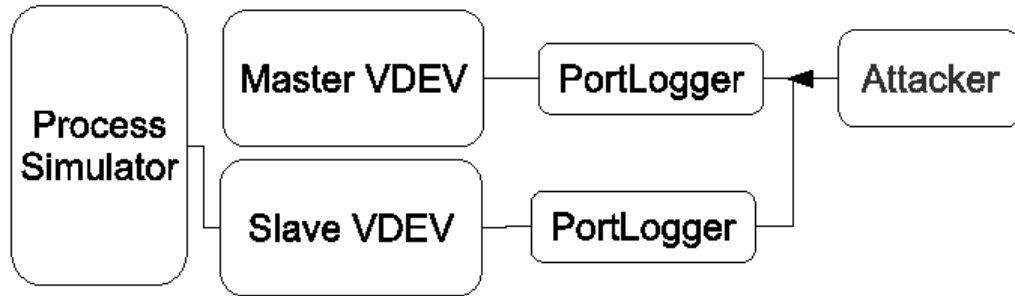


Figure 7.3

One Hertz Injection Attack Setup

doterminals. The attack code was compiled from the C source, and when run was assigned to inject the packets on the PortLogger connected to the Master so they could be logged. Before the attack was run, the system was placed into auto mode.

Figures 7.4 and 7.5 show plots of the tank level as recorded by the master over a period of 5 minutes. In both systems, the sharp jumps from the correct level range of 50-60% down to 23% indicate that the attack was successful. Comparing the two graphs, it is clear that the attack was effective against both systems; however, the attack was more effective against the virtual system than the laboratory system.

The time of sending of the attack packet is random with respect to the request/response “rhythm” of the system; the attack succeeds when a master sends a read request and the first packet it receives is the injected packet. In the laboratory system, any data sent to the PLC before the request is sent is ignored. In the virtual system, the data is buffered until read by the ICS Client code. Because there is a greater threshold of time for the attack to arrive to be successful against the virtual system than the laboratory system, the attack is more effective against the virtual system. Achieving complete fidelity for this attack

would likely require adding a flush() call before sending a request in the ICS client code; this will be explored in future work. In any case, such behavior may be expected for two different ICS devices under attack. For example, there is no guarantee that a Siemens PLC and a Rockwell PLC will be vulnerable to this attack in exactly the same way. Because ICS systems consist of heterogeneous components, the differing behavior does not negate the usefulness of the testbed.

The remaining attacks make use of the laboratory and virtual pipeline systems connected with the proprietary wireless system. These attacks assume that an attacker has infiltrated the radio system.

One slave radio was attached to a PC to run the attacks from. Two radios were connected to a USB serial port device to the virtual testbed host machine. Each of the virtual devices in the virtual testbed was connected to individual PortLogger instances; each instance was connected to one serial port and created a pseudoterminal that a virtual device connected to. Laboratory system traffic was taken using serial tap cables placed between each PLC and radio, and only received packets were logged.

The second attack demonstrated in the system is a slave denial of service attack against the pipeline system using the ICS radios. The attacker, with his own slave radio, is continuously transmitting data to cause the legitimate slave's packets to not be received. The end result is that a master will not have updates for the responses sent by the slave, and will store the same values for as long as the attack lasts.

Figures 7.6 and 7.7 shows the pipeline pressures received by the master unit while the systems are under attack. The virtual system is attacked roughly 50 seconds after the start

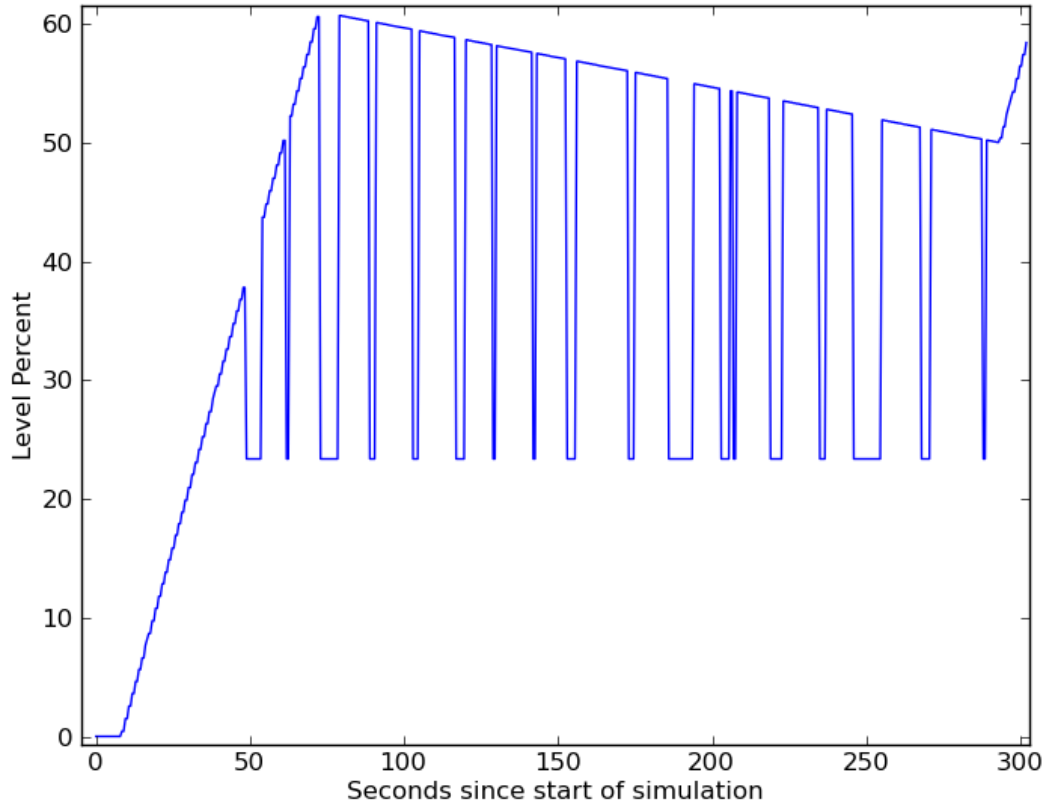


Figure 7.4

Virtual System Tank Levels During Injection Attack

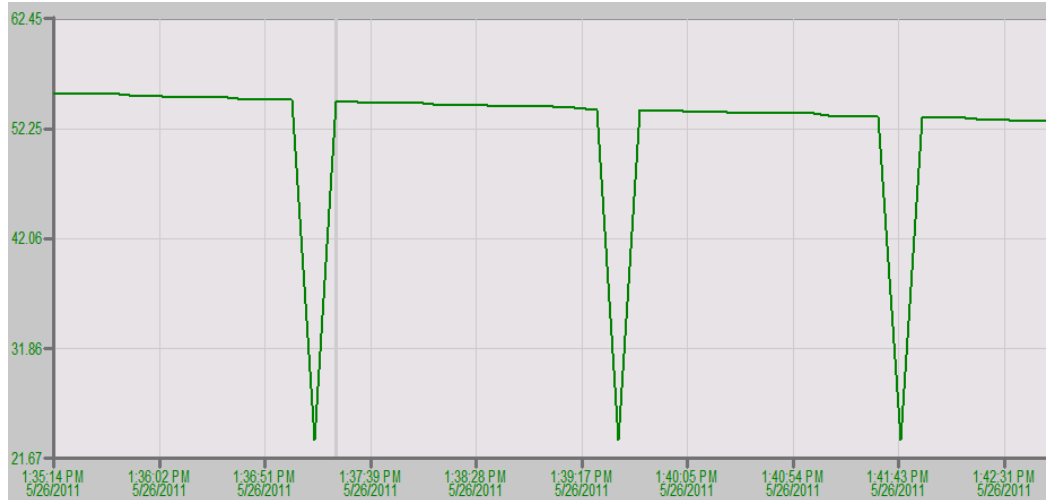


Figure 7.5

Laboratory System Tank Levels During Injection Attack

of the plot. Before the attack is run, the pressure in both systems oscillates around the 10 PSI setpoint. During the attack, the reported pressure stays constant, indicating a loss of reading from the slave, which is still reading the correct amount and controlling the pipeline. The constant value is seen after 50 seconds in the virtual system, within seconds after the attack is started; likewise, the Laboratory system shows a constant value starting at 12:22:30 PM. Midway through attacking the laboratory system, pressure in the pipeline was released and manually held at zero to verify that the attack was functioning. When the attack is stopped, the correct reading is seen also within seconds; this occurs around 12:28 in the laboratory system and 175 seconds in the virtual system.

In the third attack, the attacker transmits meaningless data consistently to create a denial of service to the slave while simultaneously responding to read requests. This creates only one response for the master to choose from, and it guarantees that the master receives

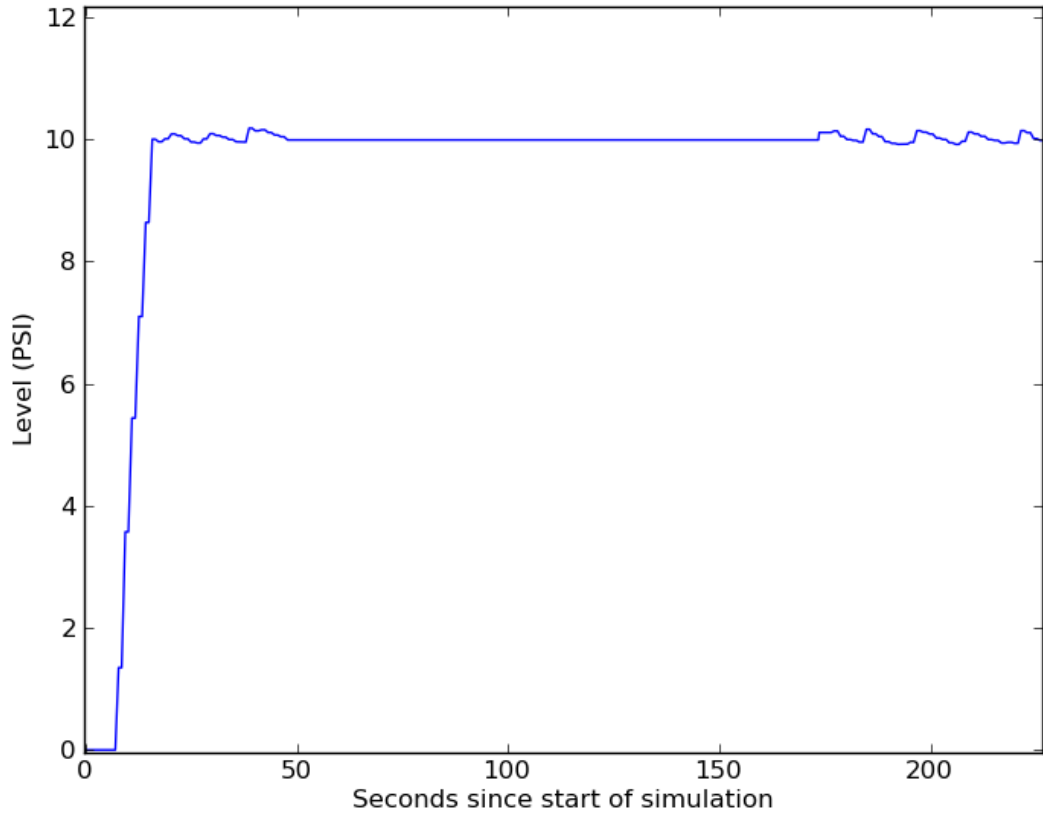


Figure 7.6

Virtual Pipeline Pressures During Radio DoS Attack

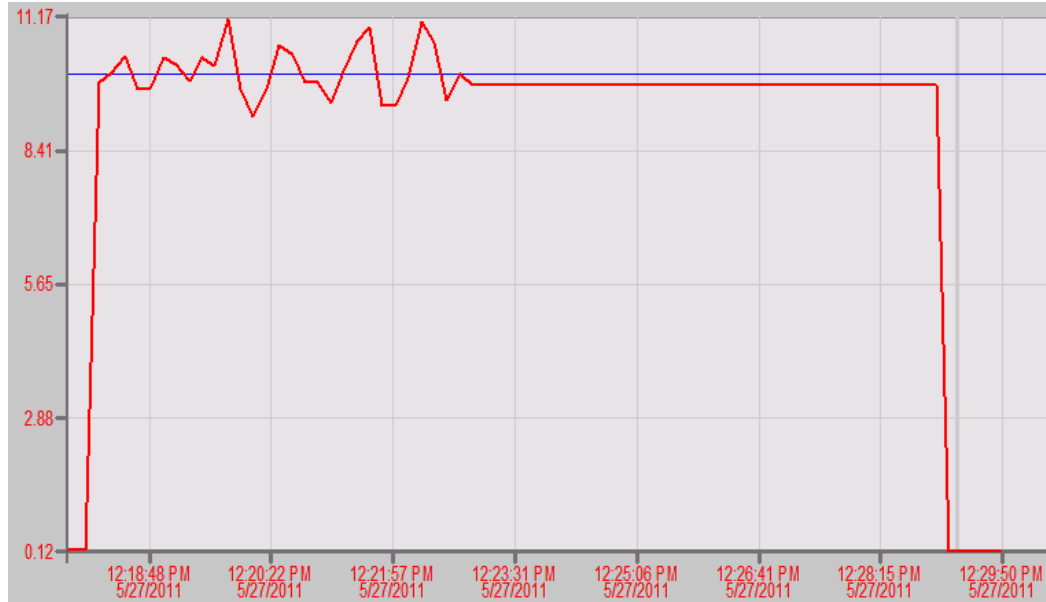


Figure 7.7

Laboratory Pipeline Pressures During Radio DoS Attack

only the values the attacker chooses. Figures 7.8 and 7.9 show the pressures received by the master unit during this attack. In both the laboratory and the simulation case, the attack is started and within 30 seconds the pressure jumps to the attacker-specified 27PSI. Once the attack is stopped, the pressure returns to the correct value within a few seconds.

The similar behavior of the two radio attacks in both systems shows that the virtual testbed can be used to test ICS equipment. Although in some cases attacks may seem to be more effective against the virtual systems, they still can be used to develop proof-of-concept attacks against ICS systems.

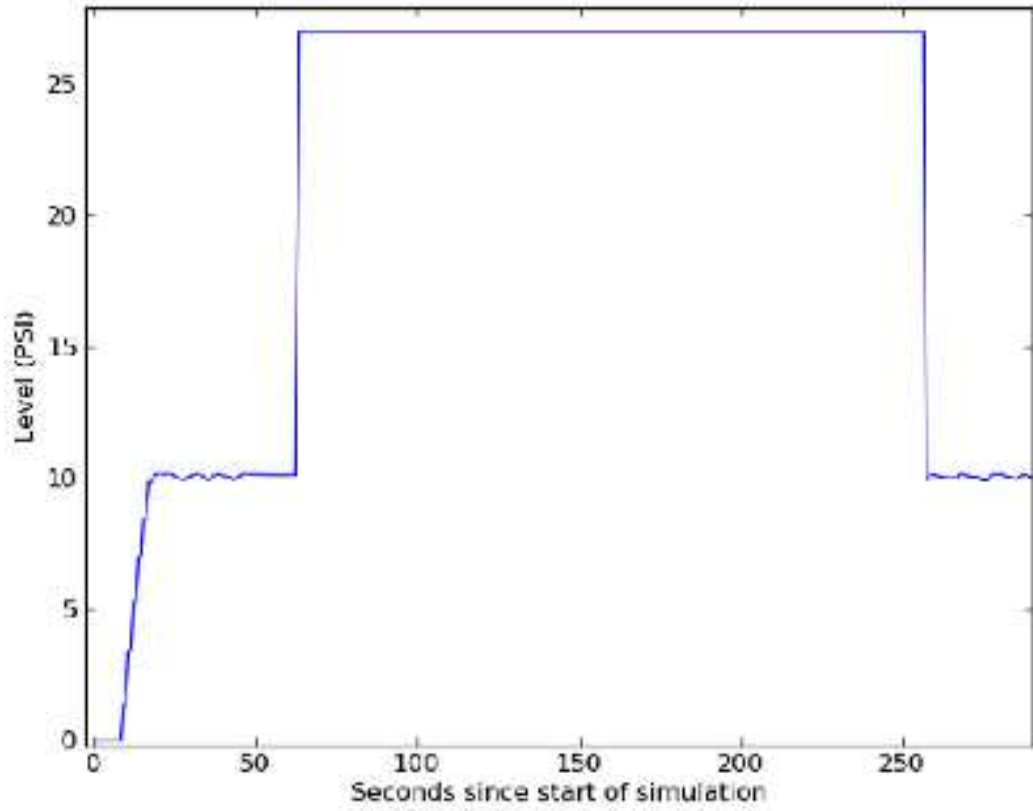


Figure 7.8

Virtual Pipeline Pressures Received During Radio DoS/Injection Attack



Figure 7.9

Laboratory Pipeline Pressures Received During Radio DoS/Injection Attack

7.3 Traffic Fidelity Analysis

This section discusses the methodology and results of comparing two virtual testbeds to the two laboratory-scale system from which they were modeled. A guide to calibrating the timing of a virtual testbed is also provided. Much of this analysis is focused on timing behavior, because timing can be very important to anomaly-based intrusion detection systems. While it is shown in Subsection 7.3.2 that it is possible to achieve low-error timing in the virtual systems, in practice many applications will not require this accuracy. Examples include applications of ICS device testing and signature-based intrusion detection systems.

7.3.1 Methodology

Comparing network traffic captures is a non-trivial task when one considers the high number of features that may be considered. Terry Brugger [20] developed a methodology for comparing IP network captures for use in IDS testing. He created “similarity metrics” which can produce a scalar value from 0 to 1 denoting how similar two captures are based on network and traffic characteristics; 1 is considered “identical,” while 0 is considered “not-identical.” Each metric measures a certain characteristic of the captures under comparison; examples include number of hosts, traffic volume per unit time, number of packets to each service, and range and frequency TTL values in IP packets.

7.3.1.1 Mathematics

There are four types of metrics: scalar metrics, discrete metrics, and ordered and sorted continuous metrics. Scalar metrics, also termed “total number characteristics,” are metrics that consist of a single value like number of hosts. Scalar metrics are defined by computing a single value (or score) for each of two captures. Similarity of the two captures with respect to these values is defined as $Similarity = 1 - \frac{|x_1 - x_2|}{x_1 + x_2}$ where x_1, x_2 are the scores of the captures.

Discrete metrics are keyed integral metrics; that is, one integer score is calculated for a finite set of key values. An example is a metric measuring number of bytes transmitted per host; the host is the key, and the byte count is the scalar metric. Discrete metrics are calculated by taking the average of the similarity scores for each measurement. That is, $similarity = 1 - \frac{1}{n} \sum_{i=0}^n \frac{|x_{1,i} - x_{2,i}|}{x_{1,i} + x_{2,i}}$ where $x_{1,i}$ is the i^{th} scalar metric in the first capture, and so on. Ordered continuous metrics are keyed non-integral, or real number, metrics. This type of metric was not used for the evaluation of the virtual testbed and will not be discussed further.

Sorted continuous metrics are based on applying a function to a capture that generates a sequence of values; an example of such a metric is interarrival time between packets. Once the two sequences are generated, their values are sorted and the similarity is calculated as: $similarity = 1 - \frac{1}{n} \sum_{i=0}^n \frac{|x_{1,i} - x_{2,i}|}{x_{1,i} + x_{2,i}}$ in the same manner as the discrete metrics. If one of the the sequences is longer than the other, the longer sequence must be reduced to be of the same length as the shorter for the metric to be calculated correctly. While a number

of techniques would work for this, Brugger uses the following algorithm to create a new sequence from the longer sequence:

- For each element in the smaller list, calculate a “normalized” index by dividing the index of the element by the length of the shorter list.
 - If the normalized index is an integer, append the value of the sequence at that index to the new sequence.
 - * If the normalized index is a real, append the average of the the values of the two elements in the larger list closest to that index.

In addition to Brugger’s metric types, for this work a fourth metric type was developed: the “sequence” metric. This metric measures sequences or patterns of packets. As an example, in a Modbus system, single-slave requests will always be followed by a response by that slave with the same address and function code. Additionally, requests tend to be sent in a highly deterministic order – a master may always read registers from slaves 1,2,3, before writing to slave 4, for example. Sequence metrics were created to ensure that this deterministic behavior is present in the virtual testbed and matches that of a real system.

This metric is more complex than the continuous metrics described above. First, an operation op is defined to return a value (number or string) based on a packet description. In a Modbus system, the returned value may be the packet source, the slave address, the function code, or another value. The set of results R of op on all packets in a given trace should have cardinality k . Second, a sequence length of l should be defined; as an example, l will be 2 if a researcher is only interested in looking at sequences of 2 packets. To compute the sequence metric, a tree is constructed for each value result of op in the capture, for a total of k trees. Each tree will be of height $l + 1$, where nodes at depths up to l have k children(one for each value in R), and the final depth holds a count, initialized to

0. To compute the counts, l packets (indexed i_0, i_1, \dots, i_l) are selected in order from the trace, and op is run on each packet. A tree is selected based on $op(i_1)$, then a child nodes are selected recursively by the value of $op(i_n)$ until the l th node is selected based on $op(i_l)$, at which time the child of the l^{th} node (which contains a count) is incremented.

For an example, suppose we have the following sequence of values in a trace: [1, 2, 1, 2, 3, 1, 2, 1, 2, 3] and we define a sequence metric over this sequence with $l = 2$. We construct trees (described in Python-style dictionary syntax) with $R = \{1, 2, 3\}$, so the initialized trees would look like: $\{1:\{1:0,2:0:3:0\}, 2:\{1:0,2:0:3:0\}, 3:\{1:0,2:0:3:0\}\}$. The first sequence selected would be [1,2], so after this sequence is parsed, the updated tree would be: $\{1:\{1:0,2:1:3:0\}, 2:\{1:0,2:0:3:0\}, 3:\{1:0,2:0:3:0\}\}$. The second sequence selected would be [2,1], and the updated tree would be: $\{1:\{1:0,2:1:3:0\}, 2:\{1:1,2:0:3:0\}, 3:\{1:0,2:0:3:0\}\}$. After parsing the trace, the final trees would be: $\{1:\{1:0,2:4:3:0\}, 2:\{1:2,2:0:3:2\}, 3:\{1:1,2:0:3:0\}\}$. The leaf nodes of this tree are the counts of particular sequences of packets. The ordered lists of leaves for two traces can be used as arguments to the discrete similarity described above to compute a similarity score.

7.3.1.2 ModbusRTU Metrics

While Brugger's methodology was useful in calculating scores for Modbus traffic characteristics, the metrics that he defined for TCP/IP networks are not helpful for comparing serial Modbus traffic. For this work, the mathematical definitions of the metrics were extended for use in Modbus RTU networks. The metrics were chosen to ensure that traffic features that model-based intrusion detection systems (like[24, 75]) might use would

be shown to be represented accurately in the virtual systems. The metrics used include capture characteristics, packet characteristics, and timing characteristics. The following metrics were defined:

- **Byte Throughput** — Count of total data bytes in a capture divided by the time from the first packet to the last packet. Computed as a scalar metric. This metric was included as it is a very basic, but important, descriptive metric of network traffic.
- **Packet Throughput** — Count of total number of packets in a capture divided by the time from the first packet to the last packet. Computed as a scalar metric. This metric was included as it is a very basic, but important, descriptive metric of network traffic.
- **Error Count** — Count of number of packets are marked as Modbus response errors (the high bit of the function code field is set). This is divided by the total number of packets to normalize comparisons between captures of different sizes, and is computed as a scalar metric. Error counts are measured and compared because a significant difference in errors indicates that two systems handle incoming packets differently (and not according to the specification).
- **Invalid CRC** — Count of number of packets with bad checksums. This is divided by the total number of packets to normalize comparisons between captures of different sizes, and is computed as a scalar metric. This metric is important as invalid CRCs may be indicators of attacks (especially radio jamming).
- **Function Code Count** — Number of packets with a given function code (from 1 to 127), calculated for each function code. This is a discrete metric. This is included because the function codes and their proportions define the behavior of the network — what data is being read and written.
- **Function Code Sequence** — This is a sequence metric that examines runs of packet function codes. The length used is 2. This metric is used to verify that network traffic proceeds in the same order in both systems — a very basic, yet important feature.
- **ID Sequence** — This is a sequence metric that examines runs of Slave IDs in ModbusRTU packets. The length used is 2. This metric is used to verify that network traffic proceeds, particularly with respect to slave polling order, in the same order in both systems — a very basic, yet important feature.
- **Byte Frequency** — Number of occurrences of a given byte in the data fields of all packets, calculated for all bytes 0 to 255. Each byte count is scaled by the total number of bytes to normalize comparisons between captures of different sizes. This

is a discrete metric. This metric was included because a novel anomaly-based intrusion detection system [78] uses the byte distribution of common services to detect intrusions in common applications like FTP or HTTP; this technique has not been applied to ICS.

- **Packet Size** — A list of all packet data lengths in the capture. This is a sorted continuous metric. This metric is included because different packet sizes would indicate that different amounts of data were being exchanged in one system rather than another.
- **Interarrival Time** — A list of the amount of time that passes between two consecutive packets for all packets in the trace. This is computed as a sorted continuous metric. This metric acts as an aggregate of all timing information and ensures that traffic proceeds at the same rate in both systems. As an example, this is relevant to intrusion detection and attacks that rely on timing to inject packets.
- **Master-Master Interarrival Time** — A list of the amount of time that passes between two consecutive packets sent by the Master device for all Master device packets in the trace. This is computed as a sorted continuous metric. This metric acts as a proxy to measure the time between requests, an important system feature.
- **Master-Slave Interarrival Time** — A list of the amount of time that passes between each pair of packets consisting of a Master packet followed by a Slave packet. This is computed as a sorted continuous metric. This metric measures, in effect, the amount of time it takes for a slave to process and respond to a request.

7.3.2 Results

This section details the traffic fidelity test results for the pipeline and ground tank systems (these systems are described in Chapter 4). For each system, a table of the similarity metrics is presented, followed by an analysis. The table presents similarity numbers for all metrics, while continuous and discrete metrics also present the average error, the maximum error, and the percent error. An error list is computed by subtracting corresponding elements of the simulated system metric list from the laboratory system metric list; lists with differing sizes are accounted for using the same technique as continuous metrics — choosing corresponding elements by normalized indexes. Average error is the arithmetic

mean of the error list, and maximum error is the maximum value of the error list. Percent error is calculated as $\%err = \frac{avg(S) - avg(L)}{avg(L)}$ where $avg()$ is the arithmetic mean operation and S and L are the simulation metric list and the laboratory metric list, respectively.

7.3.2.1 Ground Tank System

Table 7.3 gives the similarity metrics for a comparison of the ground tank simulation system and the MSU laboratory scale system. The capture taken from the MSU laboratory system was acquired by directly connecting the master and slave units with a tap cable and recording the traffic; the system was left switched in the off mode for 291 seconds, and 2419 packets were captured. The capture taken from the virtual system was created using a PortLogger with baud rate emulation with the virtual system also in off mode; 3173 packets were captured in 393 seconds. The same processes were repeated to obtain system captures of the systems in auto mode. The virtual system auto mode capture consists of 2045 packets taken over 255 seconds, while the laboratory system capture contains 2268 packets taken over 272 seconds.

In the off mode comparison, the packet size similarity is 1, implying that both traces have exactly the same distribution of packet sizes. Byte Throughput and Packet Throughput similarity metrics very close to unity (0.98493 vs. 0.98495, respectively); the closeness of these similarities follows from the packet size similarity. There were no error packets present in either capture, leading to an Error Count similarity of unity; the Invalid CRC metric is 1 for the same reason. The Function Code count metric is .99996, indicating that the same proportion of function codes is present in both captures; similarly, the Function

Table 7.3

Similarity Metrics For the Ground Tank System(Off Mode)

Name	Similarity	Average Error	Max. Error	Percent Error
Byte Frequency	0.27601	0.00000	0.01613	-0.000%
Byte Throughput	0.98493	4.32641	4.32641	-2.969%
Error Count	1.00000	-	-	-
Function Code Count	0.99996	-0.00000	0.00032	0.000%
Function Code Sequence	0.99964	-	-	-
ID Sequence	0.99995	-	-	-
Interarrival Time	0.93533	0.00366	0.06616	3.046%
Invalid CRC	1.00000	-	-	-
Master-Master Interarrival Time	0.94912	0.00731	0.07220	3.038%
Master-Slave Interarrival Time	0.91356	0.00548	0.01950	14.420%
Packet Size	0.99999	-0.00083	0.00000	-0.004%
Packet Throughput	0.98495	0.24693	0.24693	-2.966%

Code Sequence metric of .99964 indicates that the function codes appear in the same order in both captures. The ID Sequence Metric of .99995 indicates that, true to the Modbus specification, the slave system responds to master system, and the master system sends requests after the slave responds.

The Byte Frequency metric is low (0.27601) because the master system reads four of the slave's analog input registers and two digital inputs; only the first of these is relevant (the tank pressure meter used to calculate the tank level). The remainder of the inputs in the laboratory system are unconnected and floating electrically; in the simulated system, these are initialized to zero and unmodified by the simulator. The floating inputs add a significant amount of noise to the byte counts for the laboratory system, and skew the byte frequency metric. This may be corrected in future work, if necessary.

Timing metrics are also presented in Table 7.3. The master-master interarrival metric is 0.94912, while the master-slave interarrival similarity was 0.91356, and the overall in-

terarrival time metric stands at 0.93533 — all better than 90%. Table 7.4 shows metrics for the ground tank system in auto mode; the similarity metrics for the auto case closely match those of the off case. A notable exception is the byte frequency, which is much higher in the auto case. The auto case improves because the many different values that the levels take help balance out the influence of the floating analog readings on this metric.

Table 7.4

Similarity Metrics For the Ground Tank System(Auto Mode)

Name	Similarity	Average Error	Max. Error	Percent Error
Byte Frequency	0.78891	0.00083	0.05283	-0.000%
Byte Throughput	0.98057	5.54963	5.54963	-3.812%
Error Count	1.00000	-	-	-
Function Code Count	0.99997	0.00003	0.00024	0.000%
Function Code Sequence	0.99966	-	-	-
ID Sequence	0.99998	-	-	-
Interarrival Time	0.93928	0.01099	0.07736	3.940%
Invalid CRC	1.00000	-	-	-
Master-Master Interarrival Time	0.94727	0.02302	0.08996	3.904%
Master-Slave Interarrival Time	0.92514	0.00488	0.06827	11.516%
Packet Size	0.99981	0.00513	8.50000	-0.027%
Packet Throughput	0.98070	0.31500	0.31500	-3.786%

7.3.2.2 Pipeline System

Table 7.6 gives the similarity metrics for a comparison of the pipeline simulation system and the MSU laboratory scale system. The capture taken from the MSU laboratory system was acquired by directly connecting the master and slave units with a tap cable and recording the traffic; the system was left switched in the off mode for 283 seconds, and 2032 packets were captured. The capture taken from the virtual system was created us-

ing a PortLogger with baud rate emulation with the virtual system also in off mode; 2259 packets were captured in 322 seconds. Captures of both systems in auto mode were also taken in the same manner; the virtual system capture contains 2056 in 287 seconds, while the laboratory system capture contains 3320 packets sent in 461 seconds.

Table 7.5

Similarity Metrics For the Pipeline System (Auto Mode)

Name	Similarity	Average Error	Max. Error	Percent Error
Byte Frequency	0.08272	0.00156	0.10680	-0.000%
Byte Throughput	0.99660	1.02567	1.02567	-0.678%
Error Count	1.00000	-	-	-
Function Code Count	1.00000	0.00000	0.00000	0.000%
Function Code Sequence	0.99961	-	-	-
ID Sequence	0.99991	-	-	-
Interarrival Time	0.92439	0.01140	0.03107	0.702%
Invalid CRC	1.00000	-	-	-
Master-Master Interarrival Time	0.98426	0.00923	0.04940	0.709%
Master-Slave Interarrival Time	0.87664	0.01051	0.03107	20.318%
Packet Size	1.00000	0.00000	0.00000	0.000%
Packet Throughput	0.99660	0.04884	0.04884	-0.678%

The packet size similarity is nearly unity – implying that both traces have the same distribution of packet sizes. Like the ground tank results, Byte Throughput and Packet Throughput similarity metrics are nearly identical and very close to unity (both 0.98789); the closeness of these similarities still follows from the packet size similarity. There were still no error packets present in either capture, leading to an Error Count similarity of unity; the Invalid CRC metric is 1 for the same reason. Similarities of 0.999 and higher should, for practical purposes, be considered to be equal to one to take into account the error introduced by scaling the counts by the packet size (floating point division) and

the other floating point operations used in computing the similarity score. The Function Code count metric is 1, indicating that the same proportion of function codes is present in both captures; similarly, the Function Code Sequence metric of .99961 indicates that the function codes appear in the same order in both captures. The ID Sequence Metric of 0.99998 indicates that, true to the Modbus specification, the slave system responds to master system, and the master system sends requests after the slave responds.

Table 7.6

Similarity Metrics For the Pipeline System (Off Mode)

Name	Similarity	Average Error	Max. Error	Percent Error
Byte Frequency	0.68909	0.00121	0.07145	0.000%
Byte Throughput	0.98789	3.61073	3.61073	-2.393%
Error Count	1.00000	-	-	-
Function Code Count	1.00000	0.00000	0.00000	0.000%
Function Code Sequence	0.99998	-	-	-
ID Sequence	0.99998	-	-	-
Interarrival Time	0.91554	0.01185	0.06021	2.447%
Invalid CRC	1.00000	-	-	-
Master-Master Interarrival Time	0.98107	0.01097	0.05039	2.442%
Master-Slave Interarrival Time	0.85615	0.01207	0.01854	30.291%
Packet Size	1.00000	0.00000	0.00000	0.000%
Packet Throughput	0.98789	0.17194	0.17194	-2.393%

The byte frequency metric is low (0.68909) for two reasons. First, although the both systems are in off mode and should have no pressure in the pipeline, the laboratory meter is miscalibrated, and 0.2 PSI is the lowest pressure the meter will read; this is not accounted for in the pipeline simulation, which yields a 0 PSI measurement. This affects the byte counts significantly, but could be accounted for in the simulator if necessary. Second, the master system reads four of the slave's analog input registers; only the first of these is

relevant (the pipeline pressure meter). The remainder in the laboratory system are unconnected and float; in the simulated system, these are initialized to zero and unmodified by the simulator. The floating inputs add a significant amount of noise to the byte counts for the laboratory system, and skew the byte frequency metric.

Timing metrics are also presented in Table 7.6. The master-master interarrival metric is 0.98426, and the overall interarrival metric was 0.91554. The master-slave interarrival metric of 0.85615 does not meet the goal of 90% similarity. This will likely be improved in future work; in any case, it may be the case that this level of similarity is sufficient for most purposes.

Table 7.5 presents similar metric values to those obtained in the off case.

CHAPTER 8

CONCLUSIONS

Presently, industrial control systems are insecure from attacks against confidentiality, integrity, and reliability of service. Current security techniques are insufficient to stop all known attacks, and many attacks have yet to be discovered. The state of ICS security research is hampered by a lack of an open, extensible, faithful ICS virtual testbed. In response to this problem, this thesis has tested the following hypothesis:

It possible to:

1. Create a virtual testbed framework using Python to create discrete testbed components
2. that is designed such that the testbeds are interoperable with real ICS devices and
3. that virtual testbeds can provide comparable (within 90% similarity) ICS network behavior to a laboratory testbed.

8.1 Contributions

A testbed was created using Python to provide independent ICS virtual devices, simulators, and logging devices. The virtual devices are able to control simulated processes, as well as communicate with each other, the simulator, and with actual ICS devices. Virtual devices are capable of supporting many more protocols than those implemented, which include Modbus/TCP and Modbus/RTU. Simulators approximate simulated processes based on control inputs from the virtual devices. Logging devices were developed to create faith-

ful captures of virtual system traffic, and also emulate the transmission characteristics of the medium.

Two virtual testbeds emulating laboratory scale ICS were developed, and traffic and behavior of these testbeds were compared to their laboratory counterparts. Virtual testbed behavior was verified quantitatively and by interoperability testing with laboratory equipment. Of the two, interoperability testing is more important because the end goal is a testbed that provides ICS functionality to researchers. However, quantitative measures that verify virtual testbed similarities provide assurances to researchers about which system features are nearly identical or indistinguishable from a real system, or those which may have some variance from an actual system. Where variances are present, researchers will know to exercise caution when developing and testing solutions that rely on the varying features. While we can show interoperability and statistical measures of system similarity, there is no existing work that sets a benchmark for how similar the system must be to be useful. For our initial implementation of testbeds, we have aimed for 90% or better similarity metrics in network traffic, perfect interoperability with real equipment, and similar behavior under attack. While 90% was selected arbitrarily, only future work that uses the testbed will be able to determine if this level of similarity is sufficient.

The testbed masters and slaves were found to be interoperable with real ICS communications equipment and real devices. The virtual and laboratory testbeds were subjected to three attacks, and the two testbeds exhibited similar, though not exact behavior. Quantitatively, the first testbed (the ground tank) proved to have greater than 90% similarity in the discussed similarity metrics in the two operation modes tested. The second testbed,

the pipeline, showed greater than 90% similarity in all but two defined metrics in both operating modes ; two of these metrics will likely be improved by better timing calibration in future work.

8.2 Future work

There are several natural extensions of this work. First, a repository for storing captures is necessary to organize contributed captures from laboratory and virtual testbeds. The repository should hold both the capture and searchable metadata, including descriptions of the captured activity and source attribution. Additionally, access to attack captures should be limited to trusted and vetted researchers. Second, several researchers have outlined attack taxonomies against common ICS protocols, including Modbus and DNP3 [29, 42, 41, 26]. Attacks described in these taxonomies should be run against the virtual systems to generate attack captures for the repository. Third, more testbed systems should be developed to exercise the flexibility in the testbed framework. Testbeds should be developed that provide more protocol diversity, integrate with higher-fidelity commercial simulation systems, and model much larger systems. Larger systems may be verified by partnering with industry. Fourth, a hardware interface to the simulator would allow the use of device discrete analog and digital inputs and outputs for pairing actual ICS devices with a simulated process. Such an interface will likely take the form of a microcontroller that provides discrete analog and digital input and outputs to the device. Input values would be read and sent to the simulator over a serial port or other communication scheme, while outputs from the microcontroller would be set by the values provided by the simulator.

Finally, the unique paradigm of ladder logic in PLC programming makes translating ladder logic into traditional programming languages like C or Python difficult. A library or domain-specific language for describing ladder logic in common high-level languages like C, Java, or Python would aid in developing new testbed device programming.

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APPENDIX A
TIMING CALIBRATION

By default, the vdevs cannot predict all the delays inherent in industrial control system processing. Even very similar systems, using the same hardware, can take varying amounts of time to run. However, for faithful traffic generation, timing delays in the virtual system will need to be similar to delays in actual system being modeled, regardless of host system performance. Modern hardware can (in general) handle the computational burden of process control and communication much faster than a typical PLC. This is fortunate, as the virtual testbed code does not have to be optimized to compete, but delays must be added that mimic the actual industrial control system timing. The following describes a process for calibrating the virtual ICS to ensure high-fidelity timing between system events. This methodology uses the similarity metrics, mentioned above, to inform the changes that must be made and to verify the results.

A.1 Timing calibration method for ModbusRTU systems

Timing in ModbusRTU systems is governed primarily by four factors: communications delay, request programming, message processing delay, and master program scan time.

Measured communications delay is mainly governed by the serial baud rate, but is also greatly affected by the logging strategy. If store-forward-type logging is used for the system trace, where a device reads a full packet from one device before relaying it to another, packet delays in the trace will be roughly double the baud rate delay, and also double the time that the packets would require without logging. If a serial tap cable is used to collect the data from the actual system, the communications delay will be roughly equal

to the baud rate. If virtual devices are connected via physical serial ports at the same speed as the physical system, no delay should need to be added to account for communications delay. If the virtual devices are connected through a PortLogger instance or other virtual serial port connection, delay will need to be introduced manually in the PortLogger – waiting the byte transmit time multiplied by the length of the packet to transmit a packet after receiving it is a good approximation of this delay. Because the it affects all packets roughly equally, communication delay it should be the first delay added before correcting other features.

Request programming describes how many requests a master sends in a program scan; a master may send no requests or many requests per program scan, but in ModbusRTU one request must be completed (or time out) before another request can begin. The timing resulting from a system that sends 2 requests per program scan is different from a system than only sends 1 request per program scan, because program scan delay tends to be much greater than response processing delay. Both the Request-Request and Response-Request timing are affected by the request programming. These features may be made more accurate by ensuring that vdev program logic mirrors the actual device logic as much as possible. If the programming is incorrect, some request types will appear to take less time than others in one trace, but not another; if the request programming is correct, no steps will need to be taken to add delays for this feature. This can be verified by ensuring that the distributions for request-response time and response-request time are roughly the same shape when comparing a virtual and actual system.

Message processing delay is the amount of time taken in receiving, processing and sending a response to a request packet. This is a main source of the timing differences between requests and responses — and, by extension, the master-slave interarrival time. This delay is best accounted for in the protocol server before sending a response to a request; adding a delay between formulating a response and sending that response is effective at improving this metric. This factor should be adjusted before adjusting the master program scan time.

Master program scan time is the amount of time that passes from one invocation of the master process control logic to the next. This is a major source of the timing from master request to master request. Because the master-master metric is the primary metric for determining this value, and other delays (especially the request-response timing) can also affect that metric, this should be the final feature to be modified.

The calibration process makes use of timing hooks placed throughout the virtual device code. The calibration process can be described simply in the following steps:

1. Ensure correct virtual device process control programming, particularly with respect to how often messages should be sent.
2. Ensure correct communications delay. If virtual communications links are used (like the PortLogger virtual serial port), delay will need to be added that is appropriate to the communications settings (baud rate, start/stop bits, and parity in serial systems).
3. Adjust message processing delay by adding delay in the slave message handler hook to change the master-slave interarrival time distribution of the virtual testbed to match the laboratory system's master-slave distribution.
4. Adjust master program scan time by adding delay in the master program hook to change the master-master interarrival time distribution of the virtual testbed to match the laboratory system's master-master interarrival distribution.
5. If similarity is not sufficient, return to step 1 and repeat with better approximations for delays.

For steps 3 and 4, the delay to be added will probably not be a static value; rather, it will be a random value based on the distribution of interarrival times in the laboratory system. This delay may be modeled by a single linear approximation taken between the highest and lowest points, a piecewise linear approximation, or a more complicated function. This modeling is basically a problem of finding the best curve fit; computational tools like NumPy or Matlab may be helpful for this. Determining sufficiency of the resulting similarity scores will be application-specific; this work aims for 90% similarity in all metrics.

A.2 Calibration Example: Ground Tank System

This subsection details the calibration of the virtual implementation of the Ground Tank system in MSU's ICS Research Lab. The virtual system is being simulated on an Ubuntu Linux system with an Intel Core2 Duo P8700 (2.53GHz) with 4GB of RAM. The virtual system is running as individual processes; the vdevs are connected by a Python virtual serial port emulator, and the process simulator communications are carried over UDP.

A.2.1 Initial Similarity Scores

Table A.1 shows the initial similarity scores before adding timing delays. It should be noted that, with the exception of the byte frequency metrics, all non-time-based metrics are above 99% similarity. However, the timing based metrics, which include both the interarrival and the throughput metrics, are between 30 and 87%.

Table A.1

Ground Tank Initial Similarity Scores

Name	Similarity	Average Error	Max. Error	Percent Error
Byte Frequency	0.43937	0.00115	0.02696	-0.000%
Byte Throughput	0.81918	-64.31988	-64.31988	44.145%
Error Count	1.00000	-	-	-
Function Code Count	1.00000	0.00000	0.00000	0.000%
Function Code Sequence	0.99997	-	-	-
ID Sequence	0.99997	-	-	-
Interarrival Time	0.62784	0.03977	0.18990	-30.622%
Invalid CRC	1.00000	-	-	-
Master-Master Interarrival Time	0.83044	0.07520	0.22098	-30.612%
Master-Master Interarrival Time (Read)	0.82243	0.14705	0.28048	-30.588%
Master-Master Interarrival Time (Write)	0.82218	0.14712	0.23618	-30.605%
Master-Slave Interarrival Metric (Read)	0.30383	0.03829	0.05414	-82.306%
Master-Slave Interarrival Metric (Write)	0.46244	0.02098	0.06054	-70.890%
Master-Slave Interarrival Time	0.38061	0.02957	0.07783	-77.877%
Packet Size	1.00000	0.00000	0.00000	0.000%
Packet Throughput	0.81918	-3.67542	-3.67542	44.145%
Slave-Master Interarrival Metric	0.87511	0.05002	0.18990	-21.748%
Slave-Slave Interarrival Time	0.82935	0.07375	0.22004	-30.611%

A.2.2 Communications delay

Adding a correct communications delay to the simulated system significantly improves the timing metrics; in the case of the ground tank, this takes the form of baud rate delay. Improvements of 3% similarity in slave-master interarrival up to an additional 44% similarity in the case of master-slave interarrival time are seen in Table A.2. This improvement is owed to the fact that the baud rate delay restricts the laboratory system's throughput and minimum response times, and similarly limits the virtual system's timing.

The baud rate delay added is described by the function $Delay = length_{bytes} \cdot 10_{bits/byte}$.

The factor of 10 represents the fact that 8 data bits are transmitted along with 1 start bit

and 1 stop bit; other serial port configurations (like 2 stop bits or parity checking) may require adjustments to this factor.

Table A.2

Ground Tank Similarity Scores After Adding Baud Rate Delay

Name	Similarity	Average Error	Max. Error	Percent Error
Byte Frequency	0.38323	0.00118	0.02687	-0.000%
Byte Throughput	0.91498	-27.07712	-27.07712	18.584%
Error Count	1.00000	-	-	-
Function Code Count	0.99995	0.00005	0.00045	0.000%
Function Code Sequence	0.99957	-	-	-
ID Sequence	0.99998	-	-	-
Interarrival Time	0.86484	0.02510	0.16736	-15.673%
Invalid CRC	1.00000	-	-	-
Master-Master Interarrival Time	0.88865	0.05310	0.18463	-15.667%
Master-Master Interarrival Time (Read)	0.91759	0.07554	0.21246	-15.636%
Master-Master Interarrival Time (Write)	0.91733	0.07564	0.16387	-15.659%
Master-Slave Interarrival Metric (Read)	0.52760	0.02996	0.04594	-64.683%
Master-Slave Interarrival Metric (Write)	0.83769	0.01026	0.02877	33.207%
Master-Slave Interarrival Time	0.82699	0.01015	0.04860	-26.738%
Packet Size	0.99998	0.00090	2.00000	-0.005%
Packet Throughput	0.91495	-1.54777	-1.54777	18.590%
Slave-Master Interarrival Metric	0.90248	0.04011	0.16736	-13.593%
Slave-Slave Interarrival Time	0.91901	0.03880	0.16870	-15.665%

A.2.3 Message Processing Delay

Modeling processing delay is less straight-forward than baud rate emulation as processing delays are not uniform across all packet types. Figures A.1 and A.2 show the sorted request-response interarrival times for the two types of requests in this system: write and read requests, respectively. Figure A.1 shows the write command times for the laboratory system (red) and the virtual system(blue). In this one particular case, the

virtual request-response times are actually equal or slightly greater than the laboratory times. Clearly, adding delay in this case will not help. However, as the system stands, this gives greater than 80% similarity with no action taken. By contrast, Figure A.2 shows the request-response times for the laboratory, the virtual system, and the difference (error) in the two values. Here, a delay in the virtual system response is required to improve the similarity scores; the amount of the delay can be determined by an approximation of the difference curve. The approximation of this difference curve will be need to be determined on a case-by-case basis. Here, as the difference curve is step-wise and somewhat linear, the delay can be modeled as a linear approximation with the argument being a random value on the interval $[0, 1)$. Specifically, this function is $delay = 0.0238522 * x + 0.0200725$ where x is a random number from 0 to 1. This delay is added as a hook to be called by the Modbus server instance immediately before sending a response; this hook only applies the delay in the event that the response is a read response, so the write request timing is unaffected. The resulting distribution is shown in Figure A.2.3. The resulting similarity metrics are given in Table A.3.

A.2.4 Master Program Scan Time

Master program scan time delay modeling is simpler than message processing delay because the request type has almost no influence over this timing feature. The Master-Master Interarrival Time metric shows best the effects of this feature; Figure A.4 shows the distribution of interarrival times; the laboratory system is shown in red, the virtual system in blue, and the difference (error) between the two distributions in green. In this case,

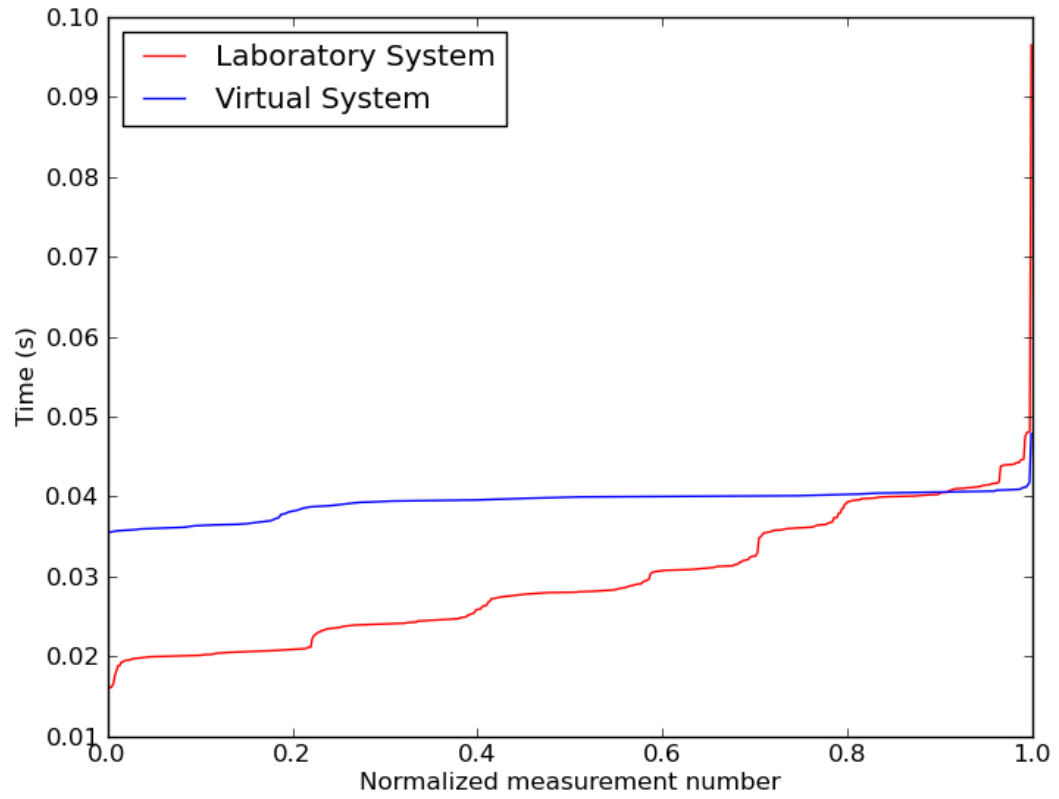


Figure A.1

Master-Slave Interarrival Distribution (Write Command)

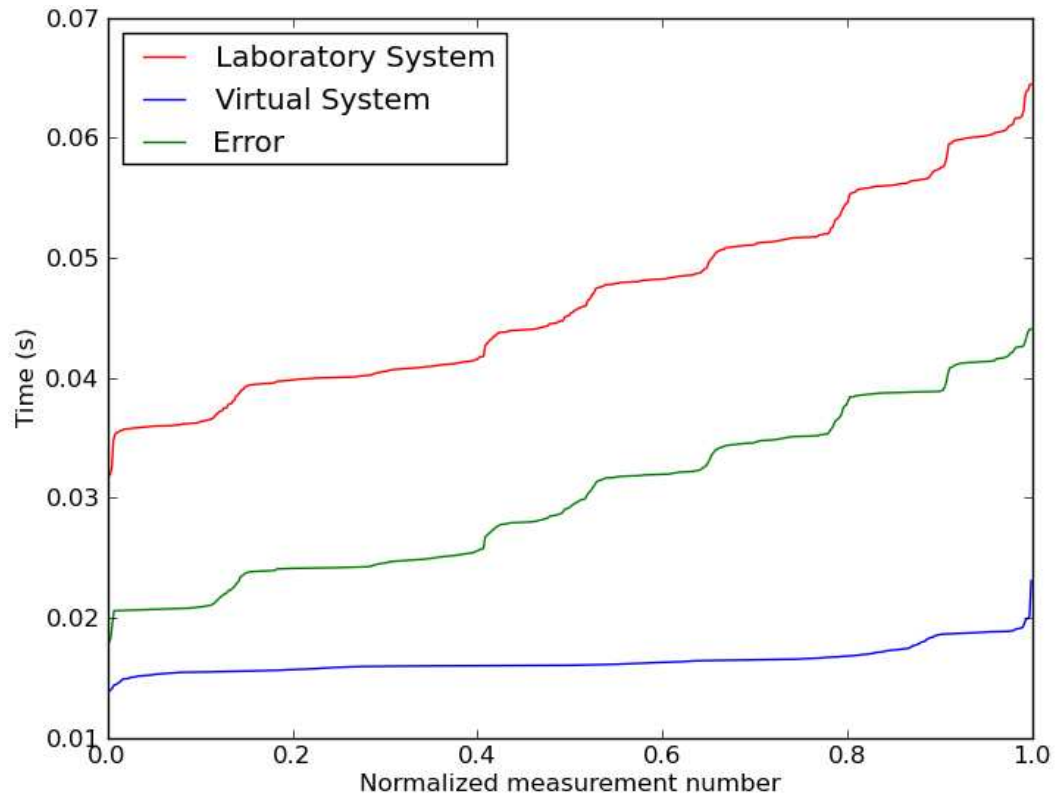


Figure A.2

Master-Slave Interarrival Distribution (Read Command)

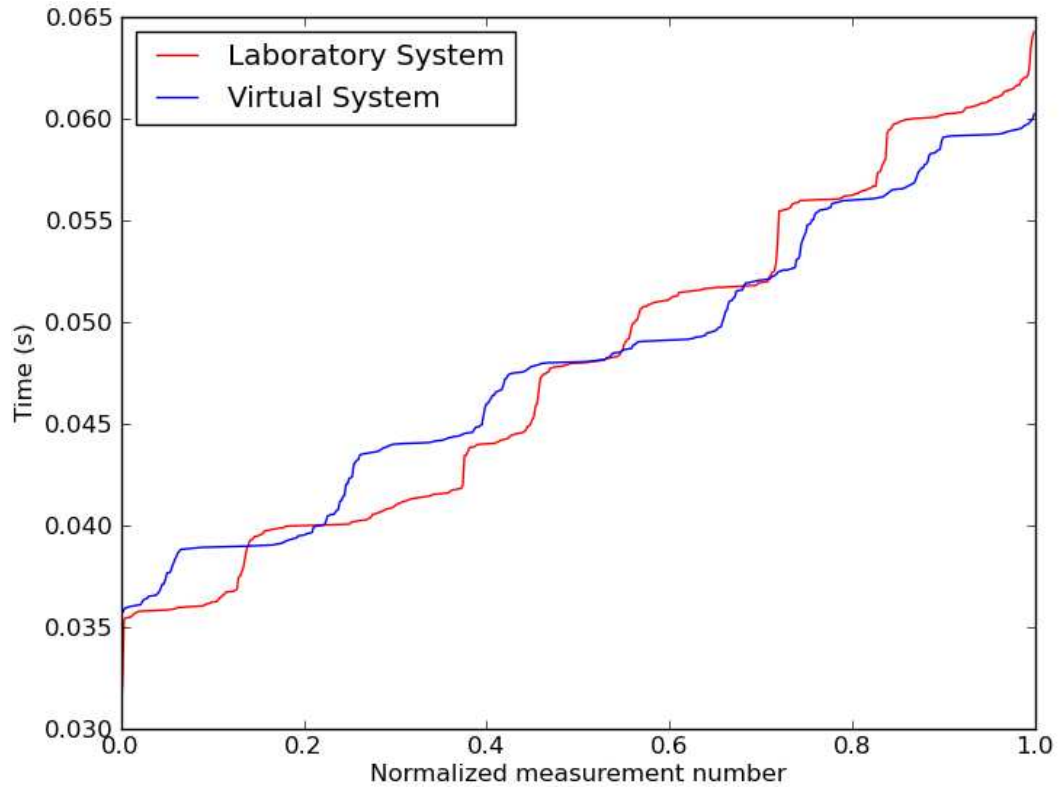


Figure A.3

Master-Slave Interarrival Distribution (Read) After Processing Delay

Table A.3

Ground Tank Similarity Scores After Message Processing Delay

Name	Similarity	Average Error	Max. Error	Percent Error
Byte Frequency	0.31821	0.00153	0.05530	-0.000%
Byte Throughput	0.95151	-14.83768	-14.83768	10.191%
Error Count	1.00000	-	-	-
Function Code Count	0.99995	0.00005	0.00042	0.000%
Function Code Sequence	0.99957	-	-	-
ID Sequence	0.99999	-	-	-
Interarrival Time	0.91319	0.02239	0.15960	-9.255%
Invalid CRC	1.00000	-	-	-
Master-Master Interarrival Time	0.91232	0.04218	0.14826	-9.264%
Master-Master Interarrival Time (Read)	0.94973	0.04832	0.12426	-9.213%
Master-Master Interarrival Time (Write)	0.95048	0.04765	0.12407	-9.252%
Master-Slave Interarrival Metric (Read)	0.98309	0.00843	0.02740	0.189%
Master-Slave Interarrival Metric (Write)	0.85697	0.00962	0.03963	26.764%
Master-Slave Interarrival Time	0.92414	0.00492	0.03506	10.619%
Packet Size	0.99998	0.00088	2.00000	-0.005%
Packet Throughput	0.95149	-0.84831	-0.84831	10.197%
Slave-Master Interarrival Metric	0.90222	0.03988	0.15960	-13.146%
Slave-Slave Interarrival Time	0.93182	0.03385	0.15883	-9.252%

the virtual system interarrival times are nearly constant, and roughly 40% of the virtual master-master interarrival times are greater than the laboratory. In this case, delay should be added only for the 60% of cases where the error is positive. The additional delay can

be modeled by the piecewise function $delay = \begin{cases} 0 & x < 0.4 \\ 0.03265 & 0.4 \leq x \leq 0.835, \text{ where } x \\ 0.61234 \cdot x & x > 0.835 \end{cases}$

is a random number from 0 to 1. Table A.4 gives the final resultant similarity scores.

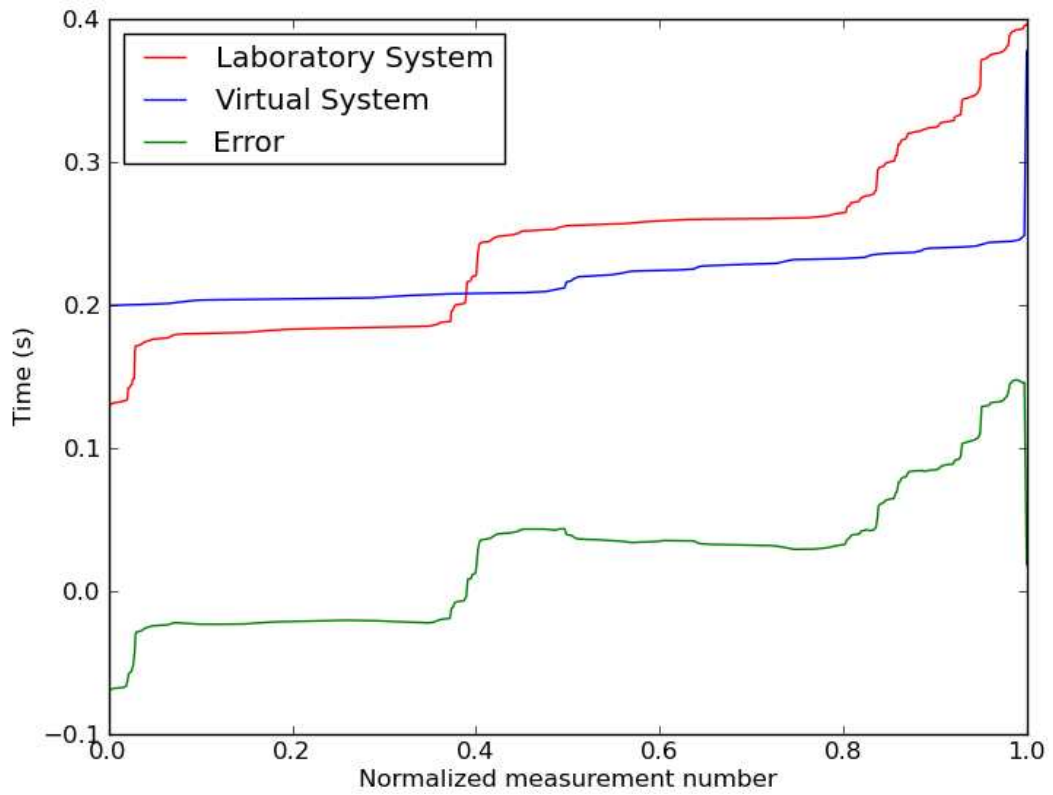


Figure A.4

Ground Tank Master-Master Interarrival Time Before Adding Delay

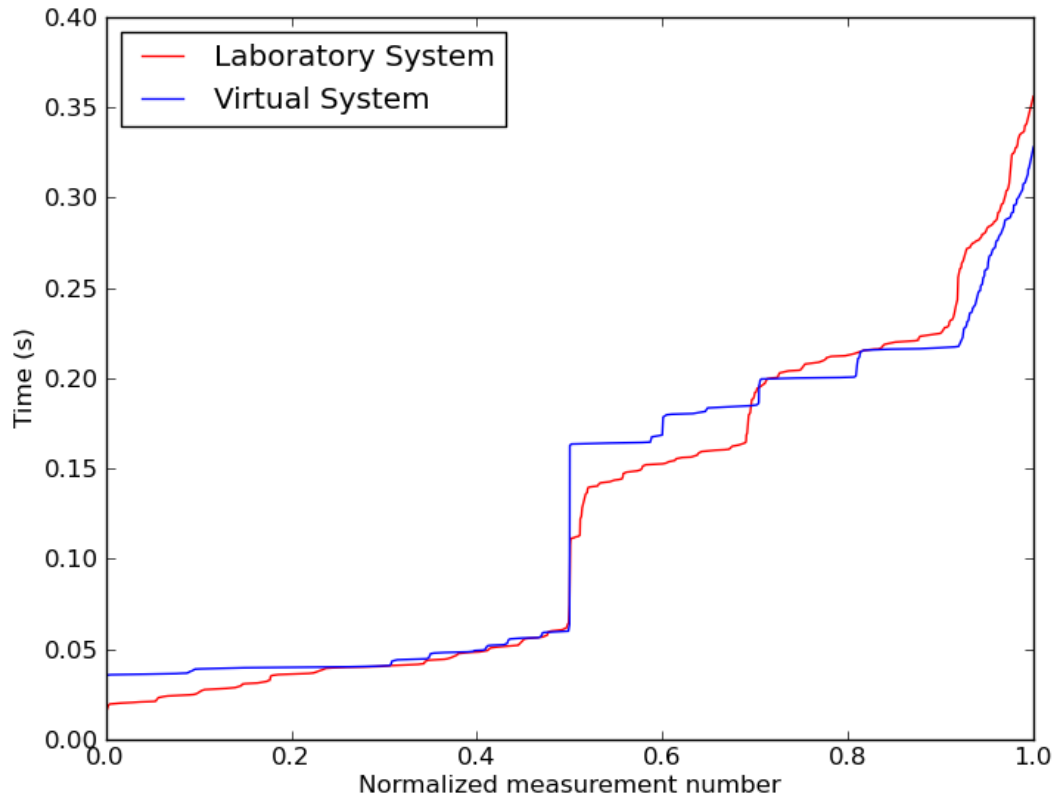


Figure A.5

Plot of Interarrival Distribution After Calibration

Table A.4

Ground Tank Similarity Scores After Adjusting Master Scan Time

Name	Similarity	Average Error	Max. Error	Percent Error
Byte Frequency	0.27601	0.00000	0.01613	-0.000%
Byte Throughput	0.98493	4.32641	4.32641	-2.969%
Error Count	1.00000	-	-	-
Function Code Count	0.99996	-0.00000	0.00032	0.000%
Function Code Sequence	0.99964	-	-	-
ID Sequence	0.99995	-	-	-
Interarrival Time	0.93533	0.00366	0.06616	3.046%
Invalid CRC	1.00000	-	-	-
Master-Master Interarrival Time	0.94912	0.00731	0.07220	3.038%
Master-Master Interarrival Time (Read)	0.98324	0.01480	0.12166	3.076%
Master-Master Interarrival Time (Write)	0.98385	0.01476	0.11869	3.069%
Master-Slave Interarrival Metric (Read)	0.97891	0.00168	0.02378	3.547%
Master-Slave Interarrival Metric (Write)	0.84308	0.00925	0.02416	31.558%
Master-Slave Interarrival Time	0.91356	0.00548	0.01950	14.420%
Packet Size	0.99999	-0.00083	0.00000	-0.004%
Packet Throughput	0.98495	0.24693	0.24693	-2.966%
Slave-Master Interarrival Metric	0.95694	0.00183	0.08783	0.904%
Slave-Slave Interarrival Time	0.96789	0.00731	0.08484	3.039%