

## Abstract

The industrial Internet of Things (IIoT) can facilitate industrial upgrading, intelligent manufacturing, and lean production. Industrial control system (ICS) is a vital support mechanism for many key infrastructures in the IIoT. However, natural defects in the ICS network security mechanism and the susceptibility of the programmable logic controller (PLC) program to malicious attack pose a threat to the safety of national infrastructure equipment. To improve the security of the underlying equipment in ICS, a model checking method based on timed automata is proposed in this work, which can effectively model the control process and accurately simulate the system state when incorporating time factors. Formal analysis of the ICS and PLC is then conducted to formulate malware detection rules which can constrain the normal behavior of the system. The model checking tool UPPAAL is then used to verify the properties by detecting whether there is an exception in the system and determine the behavior of malware through counter-examples. The chemical reaction control system in Tennessee-Eastman process is taken as an example to carry out modeling, characterization, and verification, and can effectively detect multiple patterns of malware and propose relevant security policy recommendations.

## Proposed Method

### 1. Research idea

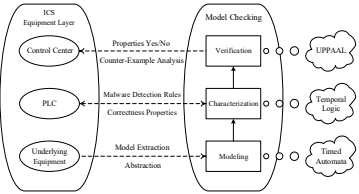


Figure 1. Model checking framework of ICS equipment layer

### 2. Implementation process

#### 1) Modeling of ICS based on timed automata

In model checking of ICS, the main concern is the value of variables in the system (including input variables, output variables, and clock variables) and their properties.

**ICS state:** State  $\sigma$  is defined as a mapping relationship between variables and values in ICS, where

$$\sigma: V \rightarrow D$$

$V$  is the set of variables.  $D$  is the set of values.  $\sigma(V)$  represents the values of some variables in state  $\sigma$ .

**Timed automata:** The states are modeled as locations and the state transitions are modeled as edge transitions, in which time can be used to model the control process.

**ICS model:** ICS model  $\xi = (V, C, Ch, L, Lp, S, P, F, I, E)$ .

#### 2) Temporal logic representations of properties

**Temporal logic** is used to describe the state transition sequence in the system and to express time implicitly through semantics.

**ICS to be attacked by malware:**

Controlling output signal (M1): Malware directly controls part of the output variables, causing abnormal behavior of the equipment itself.

Manufacturing equipment conflict (M2): Malware destroys the security lock, and makes the mutually exclusive process concurrent.

Tampering control logic (M3): Malware changes the logic relationship by tampering with the control logic of PLC.

Denial of service attack (M4): Malware adds a conditional branch to the system.

**Design strategies of attack modes:**

Threshold, conflict, logic, liveness and availability strategies

#### 3) Verification by model checking tool UPPAAL

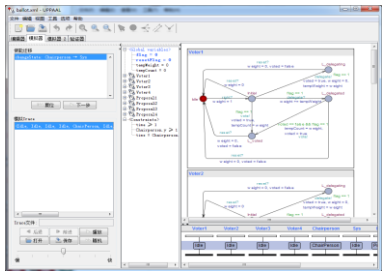


Figure 2. Verification

## Experiment

### 1. Case introduction

Tennessee-Eastman (TE) process is a model for testing continuous process control methods. Based on the abstraction of a real chemical system, it can simulate the impact of different attacks on the system in ICS security research. The TE process consists of five components: a condenser, reactor, gas-liquid separator, stripper, and circulating compressor.

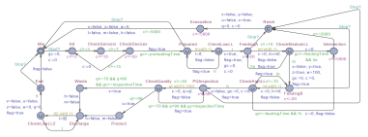


Figure 3. The main model of CRCS (System)

### 1) Threshold constraints

P1:  $A[] w=0$  or  $w=100$

### 2) Conflict constraints

P2:  $A[] !(x \text{ and } y)$

P3:  $A[] !(u \text{ and } v)$

P4:  $A[] !(x \text{ or } y) \text{ and } (u \text{ or } v)$

P5:  $A[] y \text{ imply } w=100$

### 3) Logic constraints

P6:  $A[] (\text{System.End and } !l) \text{ imply } (l \text{ and } !v)$

P7:  $A[] (\text{System.FeedingB and } l \text{ and } m) \text{ imply } !x$

P8:  $A[] (\text{System.CheckQuality and } l \text{ and } m \text{ and } h) \text{ imply } q >= 90$

P9:  $A[] u \text{ imply } q >= 90$

### 4) Liveness constraints

P10:  $E << s$  and  $(u \text{ or } v)$

P11:  $!s \rightarrow !x \text{ and } !y \text{ and } !u \text{ and } (v \text{ or } (\text{System.c} <= 5000))$

P12:  $A[] \text{System.Intervention imply } gc >= 5000$

### 5) Availability constraints

P13:  $A[] \text{not deadlock}$

### 2. Verification Results

Table 1. Model checking verification results in UPPAAL

Property	Time	Result	Time	Result
P1	0.244	满足	31556	满足
P2	0.252	满足	31568	满足
P3	0.262	满足	31556	满足
P4	0.248	满足	31556	满足
P5	0.220	满足	31568	满足
P6	0.280	满足	31568	满足
P7	0.218	满足	31552	满足
P8	0.282	满足	31552	满足
P9	0.992	满足	31560	满足
P10	0.020	满足	31560	满足
P11	0.281	满足	31520	满足
P12	0.284	满足	30252	满足
P13	1.218	满足	31636	满足

### 3. Counter Example Analysis and System Improvement

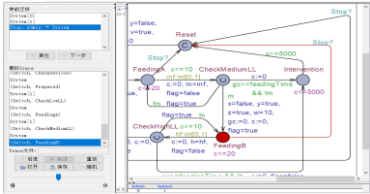


Figure 4. The counterexample of P5 in CRCS with M1

Table 2. Model checking verification results of malware (S: Satisfied, US: Unsatisfied)

	P1	P2	P3	P4	P5	P6	P7	P8	P9	P10	P11	P12	P13
M1	US	S	S	S	US	S	S	S	S	S	S	S	S
M2	S	US	S	S	S	S	US	S	S	US	US	S	US
M3	S	S	S	S	S	S	S	US	US	S	S	S	S
M4	S	US	US	US	US	US	US	US	US	US	US	US	US

## Conclusion

ICS equipment security in the IIoT will usually only analyze the PLC program itself, ignoring the modeling combined with the control process. Based on the above analysis, a method of ICS equipment security model checking based on timed automata was proposed in this work. Timed automata are employed for system modeling, temporal logic is used in property characterization, and UPPAAL is used to verify the system. Contrasting from the general model checking work, according to the security requirements of ICS equipment, the design strategies of five kinds of properties which can restrict normal behavior were empirically studied, and the anomalies detected were then used to judge malicious attacks.

## References

- [1] L. Lemaire, J. Vossart, J. Jansen, "A logic-based framework for the security analysis of industrial control systems," Autom. Control Comput. Sci., vol. 51, no. 2, pp. 114–123, Mar. 2017.
- [2] R. Alur and D. L. Dill, "A theory of timed automata," Theor. Comput. Sci., vol. 126, no. 2, pp. 183–235, Apr. 1994.
- [3] G. Wang, L. Zhuang, R. Wang, "Modeling and verifying on timed automata based Internet of things gateway security system," J. Commun., vol. 39, no. 3, pp. 63–75, Mar. 2018.
- [4] M. T. Khan, D. Serpanos, H. Shrobe, "ARMET: Behavior-based security and resilient industrial control systems," Proc. IEEE, vol. 106, no. 1, pp. 129–143, Jan. 2018.
- [5] S. Kriaa, M. Bouissou, Y. Laarouchi, "A new safety and security risk analysis framework for industrial control systems," J. Risk Reliab., vol. 233, no. 2, pp. 151–174, Apr. 2019.

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