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Cyber Security Logical and Probabilistic Model of a Critical Infrastructure Facility in the Electric Energy Industry

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Abstract

In the work, a cyber security logical and probabilistic model of a critical infrastructure facility in the energy sector was developed and investigated. The cyber security logical and probabilistic model describes the development of adverse events that arise in the Industrial Control System of the electrical network from the realization of possible threats from cyberspace, such as attacks on the protection system through the corporate network, connection through a modem and wireless connection. The resulting model is based on sequentially developed structural, logical and probabilistic models.

The field of use of the developed model is automation systems for designing information protection systems or designing trajectories of attacks on these systems. The model was also applied to study the sensitivity of the probability of the development of adverse events to variations in the probability of realization of possible threats to the system.

Keywords: Critical infrastructure, Cyber security logical and probabilistic model, ICS, SCADA

Introduction

With the development of information and communication technologies, the number of threats and cyberattacks on critical infrastructure objects from cyberspace is increasing. In particular, in recent years, Ukraine has suffered and overcome the consequences of dozens of powerful cyber attacks. Among the most largescale and well-known were - an attack against the information system "Vybory" during the presidential elections of Ukraine (May 2014), cyber attack of the BlackEnergy Trojan program on "Prykarpattia-oblenergo", "Chernivtsioblenergo" and "Kyivoblenergo" (December 2015), attack on "Ukrenergo" (December 2016), M.E.Doc backdoor attack (April 14, 2017), large-scale attack by the NotPetya worm (June 27, 2017) and others.

The intensity of cyberattacks on critical infrastructure facilities can be explained both by the motivation of attackers and by defects in the automated process control systems of Industrial Control System, systems of Supervisory Control and Data Acquisition of critical infrastructure and their components.

At the moment, a lot of attention is paid to issues of ensuring cyber security of critical infrastructure objects. The works [1] - [3] analyzed possible threats to critical infrastructure objects. The relevance and importance of cyber protection of these objects at the country level have been determined.

Threat modeling and risk analysis is an effective tool for designing, researching and monitoring the process of operating critical infrastructure facilities and has been studied by many scientists. In works [4], [5], the tasks of threat modeling, cyber security analysis and other aspects of the security of critical infrastructure objects are considered, taking into account feedback, cascading effects and relationships between objects. In works [6], [7] models of cyber security analysis of objects of critical infrastructure of the energy sector are proposed.

In [8], a logical and probabilistic method for assessing the security of structurally complex systems was proposed and developed. In works [9] - [14], the problems of further development and use of the logical and probability method in various fields were considered. In works [13], [14], the problems of modeling the development of adverse cyber security events were solved using the logical and probabilistic method. Recently, the energy infrastructure has been a special object of attention of cyber-attackers. Taking into account the importance and relevance of cyber protection of the mentioned objects and the insufficient development of the problem, it is currently necessary to conduct further scientific research.

The aim of the research. The purpose of the work is the development and research of a cyber security logical and probabilistic model of a critical infrastructure object in the energy sector, subject to the realization of a set of possible threats from cyberspace.

Logical and probabilistic cyber security risk model of Industrial Control System. Consider the threats from cyberattacks on critical infrastructure facilities in the energy sector, which were identified in a report of the US Government Accountability Office (US GAO) at the request of the US Congress [3]. In the report states that the protection of objects of this class is an important and relevant component of US national security.

A typical structure of an electric network (Fig. 1) consists of three levels: generation and storage, transmission and distribution of electricity between consumers [3].

The basis of the first level contains power stations, renewable energy sources, energy storage equipment, step-up transformer substations. The second level consists of longdistance high-voltage power transmission lines. The third - step-down transformer substations, users, as well as low-voltage renewable sources of energy production and storage.

This network is managed by an Industrial Control System (ICS). The ICS includes a Supervisory Control and Data Acquisition (SCADA) together with a Distributed Control System (DCS) and a system of Programmable Logic Controller (PLC). In some cases, the functions of the ICS can be performed by the SCADA system.

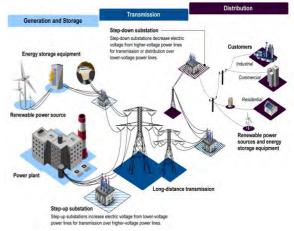


Figure 1: The electrical network structure [3]

Unfortunately, ICS systems have significant shortcomings in information security, which are implemented by Cyber Security Systems (CSS).

Due to the ubiquity of IP protocol and web technologies (WebSCADA), ICS inherent threats to conventional IT systems. In addition, the vast majority of DCS and PLC systems have imperfect or outdated information protection elements. In report [3], the main cyber threats to the energy network management system were identified (Fig. 2).

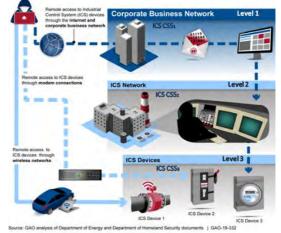


Figure 2: The main cyber threats to the energy network management system [3]

As defined in the report, the attacker has three possible scenarios for conducting a remote attack on the ICS: the first is via the Internet - access and the corporate business network, the second is a connection via a modem, and the third is via a wireless connection.

Unfavorable events that occur in the ICS of the electrical network from the realization of possible threats from cyberspace can be estimated using a logical and probability model [8]. According to the procedure for building logical and probabilistic models, we will form a structural, logical and probabilistic model of ICS security of the electric network.

Based on the functional scheme of conducting a remote attack on ICS control bodies (Fig. 2), the initiating events can be determined (Fig. 3): interception of control of ICS control bodies via the Internet - access through the corporate business network (event 1), over a modem connection (event 2) and over a wireless connection (event 3). Initiating conditions define the fact that the attacker has overcome the cyber protection systems of the corporate network (upper level) ICS CSS₁ (condition 4), distributed control system network cyber security systems (middle level) DCS ICS CSS₂ (condition 5) and programmable logic controller system cyber security systems (low level) PLC ICS CSS₃ (condition 6).

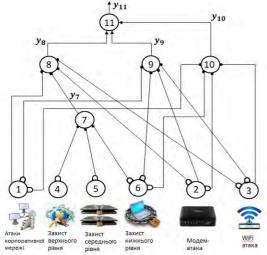


Figure 3: A direct structural diagram of the development of an adverse event

Fig. 3 shows the events that lead to the occurrence of an undesirable event - the compromise of the protection system of the control bodies of the lower-level PLC ICS CSS_3 automatic control system. An event will occur if at least one of the three triggering events 1-3 occurs.

At the first level, 6 functional vertices are depicted, which denote the initial elementary random events $x_1 - x_6$. The mentioned events occur with known probabilities of their occurrence P_{j} , j=1,...,6.

Table 1. System of logical equationsdevelopment of an adverse event fromimplementation of possible threats

$y_1 = x_1$	$y_7 = \bar{y}_4 \bar{y}_5 \bar{y}_6$
$y_2 = x_2$	$y_8 = y_1 \bar{y}_2 \bar{y}_3 y_7$
$y_3 = x_3$	$y_9 = \bar{y}_1 y_2 \bar{y}_3 \bar{y}_6$
$y_4 = x_4$	$y_{10} = \bar{y}_1 \bar{y}_2 y_3 \bar{y}_6$
$y_5 = x_5$	$y_{11} = y_8 \lor y_9 \lor y_{10}$
$y_6 = x_6$	

In the table 1 shows a system of logical equations under which an undesirable event will occur:

- the direct output function reflects the general $y_{11} = y_8 \lor y_9 \lor y_{10}$ conditions for the occurrence of an undesirable event, which includes the disjunction of three events, namely y_8 - the interception of control of the ICS control bodies by access through the corporate business network (event 1), y_9 – gaining access through a modem connection (event 2), y_{10} – gaining access through a wireless connection (event 3);

- the event of interception of the management of the ICS control bodies at the lower level by access through the corporate business network $y_8 = x_1 \bar{x}_2 \bar{x}_3 y_7$ occurs on the condition that there is an attack x_1 on the corporate business network, there are no direct attacks x_2 and x_3 through modem and wireless connection and execution conditions $y_7 = \bar{x}_4 \bar{x}_5 \bar{x}_6$ of simultaneous conjunctive overcoming of three levels of cybernetic protection mechanisms x_4 , x_5 and x_6 ;

- the event of interception of the management of the control bodies at the lower level by access through the modem connection $y_9 = \bar{x}_1 x_2 \bar{x}_3 \bar{x}_6$ occurs under the condition of the presence of an attack x_2 via the modem connection, the absence of direct attacks x_1 and x_3 via the corporate business network, wireless connection uniting and overcoming the mechanism of cybernetic protection x_6 ;

- interception of lower-level controls by access via wireless connection $y_{10} = \bar{x}_1 \bar{x}_2 x_3 \bar{x}_6$ occurs under the condition of presence of attack x_3 via wireless connection, absence of direct attacks x_1 and x_2 via corporate business network and modem connection and overcoming the mechanism of cyber protection x_6 .

By combining the logical conditions (Table 1) and solving the corresponding system of logical equations, we will obtain the conditions for the realization of an undesirable event - the compromise of the protection system of the control bodies of the automatic level control system PLC ICS CSS₃:

$$y_{11} = (x_1 \bar{x}_2 \bar{x}_3 (\bar{x}_4 \bar{x}_5 \bar{x}_6)) \lor (\bar{x}_1 x_2 \bar{x}_3 \bar{x}_6) \lor \lor (\bar{x}_1 \bar{x}_2 x_3 \bar{x}_6) = (x_2 \bar{x}_1 \bar{x}_3 \bar{x}_6) \lor (x_3 \bar{x}_1 \bar{x}_2 \bar{x}_6) \lor \lor (x_1 \bar{x}_2 \bar{x}_3 \bar{x}_4 \bar{x}_5 \bar{x}_6).$$
(1)

All members of the disjunction (1) are pairwise orthogonal, so we will obtain analytical indicators of probability estimation using the corresponding probability functions. In general, the procedure of orthogonalization of logical functions can be performed with the help of standard Python language libraries.

Using the theorems of multiplication of probabilistic dependent events and addition of probabilities of incompatible events, we will rewrite relation (1) in probabilistic form:

$$P_c = P_2 Q_1 Q_3 Q_6 + P_3 Q_1 Q_2 Q_6 + P_1 Q_2 Q_3 Q_4 Q_5 Q_6 =$$

 $=(P_2Q_1Q_3+P_3Q_1Q_2+P_1Q_2Q_3Q_4Q_5)Q_6\ , \qquad (2)$

where P_c is the probability of an undesirable event, P_j , j=1,...,6 is the probability of the original elementary random events, Q_j , j=1,...,6is the probability that the undesirable event will not occur.

Given that $Q_j = 1 - P_j$, j = 1,...,6, we rewrite relation (2) in the form:

 $P_c = [P_2(1 - P_1)(1 - P_3) + P_3(1 - P_1)(1 - P_2) + P_1(1 - P_2)(1 - P_3)(1 - P_4)(1 - P_5)](1 - P_6). (3)$

Ratio (3) is a logical-probabilistic model of the probability of an undesirable cyber security event of a critical infrastructure object in the energy sector in the event of the realization of a set of possible threats from cyberspace.

Examples of the use of the logical and probability model. The main purpose of the logical and probability model (3) is to use it in automation systems for designing information protection systems or designing attack trajectories for these systems. At the same time, this model can directly be the basis for studying properties of the system some under consideration.

Let's consider several examples of the use of the logical and probability model (3) of the development of an adverse cyber security event from the realization of possible threats. The problem statements of such studies to determine the properties of reliability or safety of complex systems were formulated in the paper [8].

We will determine the probability of the development of an adverse cyber security event from variations in the probability of the implementation of initial threats to the ICS system. For this, by the method of expert evaluations, we determine the probabilities P_{j} , j=1,...,6 of the realization of the original elementary random events (threats) x_{j} , j=1,...,6 (Table 2).

Table 2	2. Probabilit	ties P_{j} ,	j=1,,6	of initial			
elementary random events							
Droho	hilition	of	D	Value	l		

Probabilities of	P_{j} ,	Value
realization of initial	j=1,,6	
elementary random events		
System attack through	P_{I}	0.5
the corporate network		
System attack through	P_2	0.6
modem connection		
System attack via Wi-	P_3	0.8
Fi connection		
Overcoming the top-	P_4	0.7
level corporate network		
security system		
Overcoming the	P_5	0.1
security system of the		
corporate network of the		
middle level		
Overcoming the	P_6	0.9
lower-level corporate		
network security system		

Substituting the values of the probabilities P_j , j=1,...,6 into the ratio (3), we get $P_c = 0.027$ - the probability of the development of an adverse event from the realization of possible threats to the ICS system.

The second example of the use of the logical and probability model (3) is the determination of the sensitivity of the system to a positive change in its elements. To do this, we successively differentiate relation (3) with respect to P_{j} , j=1,...,6 and obtain: $\partial P_c/\partial P_1 = -P_2(1-P_3)(1-P_6) - P_3(1-P_2)(1-P_6)$

 $\begin{array}{l} \partial P_c / \partial P_1 = -P_2 (1 - P_3) (1 - P_6) - P_3 (1 - P_2) (1 - P_6) \\ -P_6) + (1 - P_2) (1 - P_3) (1 - P_4) (1 - P_5) (1 - P_6); \\ \partial P_c / \partial P_2 = (1 - P_1) (1 - P_3) (1 - P_6) - P_3 (1 - P_6); \\ \partial P_c / \partial P_3 = -P_2 (1 - P_1) (1 - P_6) + + (1 - P_1) (1 - P_2) (1 - P_6) + (1 - P_2) (1 - P_6); \\ \partial P_c / \partial P_4 = -P_1 (1 - P_2) (1 - P_4) (1 - P_5) (1 - P_6); \\ \partial P_c / \partial P_5 = -P_1 (1 - P_2) (1 - P_3) (1 - P_4) (1 - P_6); \\ \partial P_c / \partial P_6 = -P_2 (1 - P_1) (1 - P_3) - P_3 (1 - P_1) (1 - P_6); \\ \partial P_c / \partial P_6 = -P_2 (1 - P_1) (1 - P_3) (1 - P_4) (1 - P_6); \\ \partial P_c / \partial P_6 = -P_2 (1 - P_1) (1 - P_3) (1 - P_4) (1 - P_5). \end{array}$

Substitute the probabilities P_j , j=1,...,6 (Table 2) into the system of equations (4). The results are presented in Table 3.

Table 3. System sensitivity $\partial P_c / \partial P_j$, <i>j=1,,6</i> to
changes in parameters P_i , $j=1,,6$

<u> </u>	j. j	
System sensitivity	System sensitivity, $\partial P_c / \partial P_j$,	Value
	j=1,,6	
The sensitivity of the system to an attack through the corporate network	$\partial P_c / \partial P_1$	-0.04
Susceptibility of the system to an attack through a modem connection	$\partial P_c / \partial P_2$	-0.03
Susceptibility of the system to an attack through a Wi-Fi connection	$\partial P_c / \partial P_3$	-0.01
The sensitivity of the system to overcoming the protection system of the corporate network of the upper level	$\partial P_c / \partial P_4$	-0.04
The sensitivity of the system to overcoming the protection system of the corporate network of a medium level	$\partial P_c / \partial P_5$	-0.09
The sensitivity of the system to overcoming the protection system of the corporate network of the lower level	$\partial P_c / \partial P_6$	-0.02

Conclusions

A cyber security logical and probabilistic model of a critical infrastructure facility in the energy sector has been developed and researched. The logical and probabilistic model describes the development of adverse events that occur in the ICS of the electrical network during the action of various threats from cyberspace. Threats include attacks on cyber protection systems through corporate networks, modem connections, and wireless connections. To create the final model, structural, cyber security logical and probabilistic models were developed sequentially.

The main area of use of the logical and probability model is systems for automating the design of information protection systems or designing the trajectories of attacks on these systems. The model was also applied to study such properties of the system as the sensitivity of the probability of the development of adverse events to the variation of the probabilities of the realization of possible threats to the system.

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