Decision Science Letters 12 (2023) 759-772

Contents lists available at GrowingScience

**Decision Science Letters** 

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# A hybrid AHP-TOPSIS for risk analysis in maritime cybersecurity based on 3D models

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CHRONICLE	A B S T R A C T
Article history:Received: January 12, 2023Received in revised format:June 2, 2023Accepted: June 28, 2023Available online:June 28, 2023Keywords:Maritime Cybersecurity (MCS)Risk Analysis3D ModelAnalytical Hierarchy Process(AHP)Technique for Order by Similarityto Ideal Solution (TOPSIS)	Emerging maritime cyber threats put Indonesia's marine technology-based systems at risk This study aims to determine the dimensions and analysis of risk assessment in maritime cyber security based on 3D models in the Indonesian sea area. A statistical descriptive qualitative method approach supported by the Analytical Hierarchy Process (AHP) and Technique for Order by Similarity to Ideal Solution (TOPSIS) methods were used in this study. Risk analysis in maritime cybersecurity has 3 (three) main criteria: Threat, Vulnerability, and consequence. Based on the results of 3D risk analysis, the six dimensions of MCS are identified as having a level of risk at Very Low and Low Risk. The highest risk value is obtained by the dimension of Cyber security-related company procedures (D2) (0.368) and the lowest risk value is Ship's systems readiness (D3) (0.048).
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### 1. Introduction

Indonesia has historically had a very dominant influence in the Southeast Asian region and even the entire Asian region. The area of Indonesia, which is two-thirds of its sea area, has the potential to unite and become a source of conflict between regions or countries, including in the national maritime aspect (Subagyo, 2018). As the largest nation made up of islands, Indonesia is situated in a geographically advantageous region that separates the Pacific and Indian Oceans and is sandwiched between the continents of Asia and Australia (Marnani et al., 2021). Because it is the world's biggest archipelago, with 17,508 islands (large and small), between 2000 and 4000 of which are inhabited, and because around two-thirds of the country's land area is water, Indonesia is regarded as a Global Maritime Fulcrum (Mursitama & Ying, 2021). Maritime cyber risk refers to the extent to which a potential state of affairs threatens a technology asset. This can result in operational, safety or security failures in shipping as a result of damaged, lost or disrupted information or systems (Desiana & Prima, 2022). Haugli et al. (2022) explained the need to provide risk assessment analysis on maritime cybersecurity. Afenyo & Caesar (2023), recommends the need for future research for risk analysis using a qualitative method approach to the indepth understanding of the main factors driving risks/attacks on maritime cybersecurity. Bolbot et al. (2020), recommends the need for future research initiatives on improving the accuracy of ratings and aggregating different risk scores on maritime cybersecurity. Noor (2022), explains the need for an analysis of risk assessment in the maritime cyber industry as a standard for cyber security. Larsen and Lund (2021), recommends the need to investigate dimensions in viewing the maritime cybersecurity domain. Yoo and Park (2021), provides several recommendations regarding cybersecurity in the maritime sector in a pairwise comparison with MCDM.

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# This study aims to investigate the dimensions and analysis of risk assessment in maritime cybersecurity by using a qualitative method approach based on 3D models. It is important to pay more attention to the behavior that occurs in maritime cyber security and to understand how we can enable maritime cyber security systems. Understanding insights related to risks in maritime security, and risk mitigation, can enrich the literature and appropriate risk consequences. This research provides insight into mitigating maritime security threats and increases security awareness in implementing management policies for the level of risk of cybersecurity threats. This research is also a valuable tool for conducting risk assessments in maritime cybersecurity and supporting cost-benefit analysis. This study uses a statistical descriptive qualitative method approach supported by the AHP and TOPSIS methods. First, this research identifies the risk elements in maritime cybersecurity. Second, provide a risk analysis of the maritime cybersecurity elements which are described with a risk map based on a 3D model. This research provides several contributions. First, maritime domain cyber security risk assessment provides an additional contribution to the field of risk management. Second, the use of research methods provides direction in risk assessment and enriches the maritime cybersecurity analysis literature. Third, the research evaluates the variables and obtains a value for each potential threat and risk from the expert's opinion and presents their judgment so that their initial evaluation can be considered balanced, and indicates directions for further analysis.

This research consists of several parts. Section 2 describes a literature review consisting of Maritime Security, Cybersecurity, Maritime Cybersecurity (MCS), and Risk Assessment. Section 3 describes the methodology which consists of research design, conceptual framework, AHP and TOPSIS method, and 3D risk analysis model. Section 4 describes the results & discussion which consists of identification of criteria and alternatives, Maritime Cybersecurity Risk Analysis. Section 5 is the conclusion of the research including research implications, limitations and future research.

# 2. Literatur Review

# 2.1. Maritime Security

Maritime security is a trendy topic. Conditions achieve their meaning through players associating the idea with others, trying to fill it with multiple topics, and taking action to honor it. Even if parties agree that maritime security is important in general, parties, time and space will always influence what that means in practice (Bueger, 2015). Therefore, searching for a definition of maritime security that is considered to be widely accepted has yielded no results. Maritime security can be analyzed similarly by recognizing the relationship with other terms. Maritime security governs the web of relations, replacing or incorporating old, well-established concepts, as well as linking with newly developed ones. At least four of these require consideration: sea power, sea security, blue economy, and human resilience. Each of these concepts directs us to a different dimension of maritime security. The concepts of sea power and sea safety are old understandings of danger at sea, the last two emerged at roughly the same time as maritime security (Bueger & Edmunds, 2020). Maritime security is defined as the protection of national interests, at home and abroad, through the active management of risks and opportunities within and from the maritime domain, to strengthen and expand a nation's prosperity, security, and resilience and to help shape a stable world (Chapsos & Malcolm, 2017). The behavior and interactions of various actors have an impact on maritime security. The notion of maritime security falls between two concepts: organizations that use unconventional frameworks, and groups that use typical security frameworks (Susilo et al., 2019). There are several threats to maritime security, such as; 1) threats of violence (piracy, sabotage, and vital objects of terror); 2) navigation threats; 3) resource threats, such as damage and pollution of the sea and its ecosystem; 4) threat to sovereignty.

### 2.2. Cybersecurity

Cybersecurity gets a lot of attention because we are constantly surprised by the ubiquitous nature, persistence, diversity and consequences of attacks. Modern information systems exhibit a distinctive dynamic design, and the wide availability of associated technologies creates fertile ground, not only for unpredictable behavior (bugs), but also for innovative malicious actors to discover and exploit new failure modes and attack vectors (Roege et al., 2017). Cybersecurity is not only about preventing hackers from accessing systems and information but also about protecting digital assets and data, ensuring business continuity, and securing the maritime industry from external and internal threats. Cyber incidents can last hours, days or weeks (Desiana & Prima, 2022). Cybersecurity is no longer just the domain of IT departments (Malatji et al., 2022). Cybersecurity is an important facilitator of digitization, but if managed improperly it can undermine all its benefits (Ghelani, 2022). Cybersecurity is generally defined as the protection of cyberspace as well as the individuals and organizations that function within cyberspace and their assets in that space (Changki Park et al., 2019). Cybersecurity can also be defined as a collection of tools, policies, security safeguards, guidelines, risk management approaches, training, best practices, assurance, and technology used to protect the cyber environment and organizational assets (Lykou et al., 2019; Tissir et al., 2021).

### 2.3. Maritime Cybersecurity (MCS)

Cybersecurity is a relatively new concept for shipping, it is not yet understood, and most maritime operators and managers have no training regarding cyber risks (Kechagias et al., 2022). Maritime Cybersecurity can be defined as part of maritime security which is concerned with protecting against cyber threats from all aspects of maritime cyber systems and maritime cybersecurity which is concerned with reducing the consequences of cyberattacks on maritime operations (Erstad et al.,

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2021). Maritime Cybersecurity is a combination of the two terms 'maritime security' and 'cyber security'. first term; maritime security, it has been argued that it has no definite meaning, and is further related to different concepts depending on the individual trying to understand it or put it into practice (Bueger, 2015). As assets in the maritime domain become more integrated with increased information sharing between ICT systems, maritime security also depends on a mature understanding of cybersecurity to operate and navigate safely and securely (Hareide et al., 2018). Based on a thorough survey of relevant literature, there are six critical dimensions and are categorized as the basis that affects maritime cybersecurity performance (Kanwal et al., 2022) likely Regulatory framework; Cyber security-related company procedures; Ship's systems readiness; Cyber training and awareness; Compliance monitoring; Human factors.

# 2.4. Risk Analysis

Risk assessment is the entire process of risk identification, risk analysis and risk evaluation. Risk can be assessed at the organizational level or departmental level for a particular project, individual activity or risk. Different tools and techniques may be appropriate in different contexts. Risk assessment provides an understanding of risks, their causes, consequences, and probabilities. Risk analysis is about developing an understanding of risk (Valis & Koucky, 2009). Risk analysis is an important methodology for cybersecurity because it allows organizations to deal with cyber threats that have the potential to affect them, prioritize the defense of their assets, and decide what security controls to implement. Many risk analysis methods are present in cybersecurity models, compliance frameworks and international standards (Insua et al., 2021).

The risk analysis can be written with the risk formula adopted by Chang et al. (2021); Octavian et al. (2020):

Risk (R) = Threat (T)  $\times$  Vulnerability (V)  $\times$  Consequence (C)

(1)

### Table 1

Value of Risk Analysis Level of Each Criteria

Likert		Risk Analysis Level	
Score	Threat	Vulnerability	Consequence
5	Very High	Very High	Catastrophic
4	High	High	Critical
3	Moderate	Medium	Moderate
2	Low	Low	Marginal
1	Very Low	Very Low	Negligible

Adopted from Kure et al. (2018) and Octavian et al. (2020).

# Table 2

Rating of the Level Value for Each Risk Analysis Criteria

Likert		Description of Risk Analysis	
Score	Threat	Vulnerability	Consequence
5	State-sponsored assaults are carried out for economic domination, information control, or national instability.	One or more major weaknesses have been identified that make the asset extremely susceptible to an attack. The organization has no capability of resisting the occurrence of a threat	The threat causes a total system loss. An extremely serious consequence that affects sailing operations occurs
4	Cyber sabotage, also known as industrial espionage, is a danger posed by industry rivals and market competitors, who frequently attack the target company's intellectual property.	One or more major weaknesses have been identified that make the asset highly susceptible to an attack. The organization has a low capability of resisting the occurrence of a threat	The threat causes major system damage. The system operations need to be stopped. High degree of operational interruption occurs
3	Cyberattacks may also be launched for illicit purposes by individuals or criminal groups.	A weakness has been identified that makes the asset moderately susceptible to an attack. The organization has the reasonable capability of resisting the occurrence of a threat	The threat causes moderate system damage. The system operations are interrupted. It requires a longer period (e.g., more than 12 h) to fix the system. The threat causes a major system damage
2	Cyber thieves, also called Terrorist groups, are frequently created by particular religious, political, and social ideas and target opposing groups, nations, and countries through their acts.	A minor weakness has been identified that slightly increases the susceptibility of the asset to an attack. The organization has a good capability of resisting the occurrence of a threat	The threat causes marginal system damage. The system operations are slightly interrupted. It requires a short period (e.g., less than 6 h) to fix the system
1	Representing an ideological motivation, such individuals/groups steal sensitive information to exploit their target.	No weaknesses exist. The organization has an excellent capability of resisting the occurrence of a threat.	The consequence of the threat is limited. It only requires a minor maintenance

Adapted from Kure et al. (2018); Octavian et al. (2020); Park et al. (2023)

762 **Table 3** Risk Level of Maritime Cybersecurity

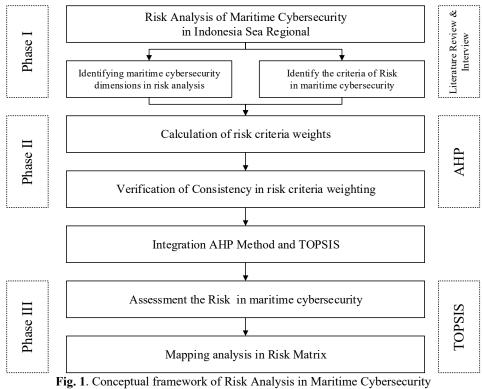
Level	Score	<b>Risk Level</b>	Description
5	0.800-1	Extreme	The risk level is extremely critical and requires the implementation of control measures to mitigate risk almost immediately. The risk level is extremely critical when the threat, vulnerability, and consequence of the risk event is extreme. Could result in serious damage that could obstruct the operations of the organization.
4	0.600-0.799	High	The risk level is highly critical and requires the implementation of the control measures for mitigating risk that has to be immediately within a short time frame. The risk impact is highly critical when the threat, vulnerability, and consequence of the risk event are extreme and/or high. Expected to have a serious impact on the organization's reputation.
3	0.400-0.599	Medium	The risk level implies that the risk has an adversarial effect on the organization and effective actions need to be applied to the contingency plan of the organization and within a specific period. It is likely to result in a short-term disruption of the organization's services.
2	0.200-0.399	Low	The risk level from the risk event requires the organization to take effective actions and may require the need for a new contingency plan as well as corrective measures.
1	0.1-0.199	Very Low	This risk level indicates that a corrective measure needs to be implemented and a contingency plan needs to be developed.

Modified from Ashraf et al. (2022); Bodeau et al. (2010); Malatji et al. (2022)

# 3. Methodology

This research was conducted in the Indonesian sea area which is part of Maritime Cybersecurity. The purpose of this study is to provide an assessment of the risks to Maritime Cybersecurity in Indonesian seas from cyber-attacks which are a current phenomenon. This research is a qualitative descriptive statistical research by applying a decision-making method with two stages of multiple criteria: a) analytical hierarchical process (AHP) and b) TOPSIS. Dimensions of risk analysis on MCS and priorities are calculated using the AHP method, which is then analyzed with TOPSIS to provide risk classification and map it in a 3D risk matrix as Octavian et al. (2020).

Questions related to risk analysis were framed on a five-point Likert scale ranging from 1 to 5 in Table 1. Eight experts were selected as Tseng et al. (2022), regarding the cyber-maritime field through purposive sampling contacted via email and google form (Akter et al., 2022) for data collection. Most of the experts in this study are high-ranking officials in the maritime field. Consulted with two experts (two high-ranking officials who have worked for more than 5 years) and two doctorates for maritime cybersecurity competence. Their opinions and suggestions helped the authors build a threat hierarchy and refine the risk analysis model.



Adopted from Biancini (2016) and Singh & Sarkar (2019)

The proposed conceptual framework of this research is presented in Fig. 1. The research objectives consisted of three parts, including:

- Identifying criteria and alternative of risk to Maritime Cybersecurity;
- Analyzing, measuring, and mapping the level of risk to Maritime Cybersecurity using the AHP-TOPSIS approach;

This research also develops a model capable of providing an assessment and measurement of the level of risk in Maritime Cybersecurity. It should be noted that the TOPSIS and AHP techniques are used because of several advantages, as were Marzouk & Sabbah (2021) and Saini & Singh (2022). The model mechanism illustrated in the flowchart shown in Fig. 1 was divided into three modification phases by Menon & Ravi (2022) and Boutkhoum et al. (2017).

Phase 1 - This article considers risk assessment in maritime cybersecurity, and defines the criteria, and dimensions of maritime cybersecurity through a review of the literature and discussions with experts to produce an overview of all the criteria that need to be considered when making decisions. This stage ends when a consensus on the criteria and types of maritime cybersecurity dimensions has been reached.

Phase 2 – Through a literature review and expert opinion, the criteria and dimensions of maritime cybersecurity are identified. Questionnaires were given to get responses in identifying criteria and produce a hierarchical structure and followed by calculating the relative importance/weight of these criteria.

Phase 3 – Analysis of risks to maritime cybersecurity is evaluated based on the parameters against the criteria. TOPSIS was adopted to rank and measure the value of the level of risk in the decision-making process as well as map the risk matrix.

# 3.1. Analytical Hirarchy Process (AHP)

AHP was developed by Saaty (2008) as a model for solving decision problems. AHP ensures that quantitative and qualitative variables can be evaluated together by considering the priorities of the decision-makers. The stages in the AHP process can be summarized as follows:

- The purpose of the problem is defined.
- The decision hierarchy framework is drawn according to the alternatives.
- Pairwise comparisons of criteria are made, and pairwise comparison matrices are developed.
- Benchmark weights are obtained from the pairwise comparison matrix.
- Consistency of specified benchmark weights is taken into account

The steps of the method can be given as follows:

- Arranging decision situations into goals, decision criteria, and alternatives.
- Creating questionnaires and collecting data. Comparisons are made for each criterion and converted into quantitative figures using linguistic terms.
- Generating pairwise comparisons for various criteria.
- Determining the weight of each criterion.
- Conducting consistency analysis. The consistency ratio is calculated based on the following steps:
  - The consistency index (CI) is determined through

$$CI = \frac{\lambda maks - n}{n} \tag{2}$$

where  $\lambda_{max}$  is the maximum eigenvalue of the judgment matrix.

1

2

- Then, the final consistency ratio (CR) is obtained from

$$CR = \frac{CI}{RI}$$
(3)

3

4

5

6

7

8

 Table 4

 Random consistency index (RI)

 n

/64
-----

Random Index (RI) $0 0 0.58 0.9 1.12 1.24 1.32 1.41$	Random Index (RI)	)	0	0.58	0.9	1.12	1.24	1.32	1.41
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Source: Octavian et al. (2020); Solangi et al. (2019)

If the CR ratio  $\leq 0.1$  (i.e. 10%), the matrix was said to be consistent decision was accepted. Conversely, CR more than implied too many contradictions in the matrix. The anticipation for the final situation was to review the matrix, and then revise the weights loaded by the vector.

# 3.2. TOPSIS

TOPSIS is a multicriteria decision analysis method, which was originally developed by Hwang and Yoon (1981) with further development by Yoon in 1981. This method is based on the concept that the chosen alternative must have the shortest distance from the positive ideal solution (PIS) and the farthest distance from the negative ideal solution (NIS). The TOPSIS method is often used because it is easy to calculate, understand, and allows alternative performance evaluations with simple mathematical models. The main steps of the TOPSIS method are given as follows:

The Likert scale is first modified into an interval scale using Microsoft Excel to analyze the questionnaire results. Then the weights for each criterion and alternative were calculated using geometric averages (Octavian et al., 2020). These geometric mean values are considered the result of group assessments of the values given by 18 experts (Calik et al., 2019).

- Creating a matrix of terrorism risk analysis decision-making. a.
- Normalizing the decision matrix. b.

$$X = \begin{bmatrix} X_{11} & X_{12} & \dots & X_{1n} \\ X_{21} & X_{22} & \dots & X_{2n} \\ \dots & \dots & \dots & \dots \\ X_{m1} & X_{m2} & \dots & X_{mn} \end{bmatrix}$$
(4)  
$$r_{ij} = \frac{X_{ij}}{\sqrt{\sum_{k=1}^{m} X_{kj}^2}}$$
(5)

Multiplying the risk matrix with the weight of each AHP criterion. c.

$$y_{ij} = w_j x r_{ij} \tag{6}$$

(5)

where i=1,...,m and j=1,...,n.

$$Y = \begin{bmatrix} w_1 & w_2 & \dots & w_m \end{bmatrix} \begin{bmatrix} r_{11} & r_{12} & \dots & r_{1n} \\ r_{21} & r_{22} & \dots & r_{2n} \\ \dots & \dots & \dots & \dots \\ r_{m1} & r_{m2} & \dots & r_{mn} \end{bmatrix} = \begin{bmatrix} w_1 x r_{11} & w_2 x r_{12} & \dots & w_n x r_{1n} \\ w_1 x r_{21} & w_2 x r_{22} & \dots & w_n x r_{2n} \\ \dots & \dots & \dots & \dots \\ w_1 x r_{m1} & w_2 x r_{m2} & \dots & w_n x r_{mn} \end{bmatrix}$$
(7)

d. Determining a positive ideal solution matrix and a negative ideal solution matrix.

$$A^{-} = (y_{1}^{-}, y_{2}^{-}, \dots, y_{n}^{-})$$
  

$$A^{+} = (y_{1}^{+}, y_{2}^{+}, \dots, y_{n}^{+})$$
(8)

Based on normalized weight, the positive ideal solution A+ and the ideal solution A- may be established (vij). Multiplying the weights of the internal service quality dimension criteria with the normalized matrix will yield the normalized weight decision matrix. Based on the normalized weight, the positive ideal solution A+ and the negative ideal solution A- may be derived (yij). Following the calculation of the value of a positive ideal solution (A+), the value of a negative ideal solution (A-) is also determined.

e. Determining the distance of each alternative (Erdogan & Kaya, 2019).

$$D_{i}^{-} = \sqrt{\sum_{j=i}^{n} (y_{ij} - y_{j}^{-})^{2}} \text{ and } D_{i}^{+} = \sqrt{\sum_{j=i}^{n} (y_{ij} - y_{j}^{+})^{2}}$$
<sup>(9)</sup>

f. Calculating the value of risk preferences of each alternative following the results of decision-makers (Sharma & Sehrawat, 2020).

$$V_i = \frac{D_i^-}{D_i^- + D_i^+}$$
(10)

Based on how close each alternative is to the ideal solution, the preference value for each option (Vi) can be determined.

### Table 5

Scale of pairwise comparison for AHP and Likert scale for TOPSIS

Scale	Description	Likert	Risk Level
9	The evidence favoring one activity over another is the highest possible order of affirmation (absolutely more important)	5	Extreme
7-8	An element is favored very strongly over another, and its dominance is demonstrated in the practice (demonstrated importance)	4	High
5-6	Experience and judgement strongly favor one element over another (essential, strong more important)	3	Medium
3-4	Experience and judgement slightly favor one element over another (moderately more important)	2	Low
1-2	Two elements contribute equally to the objective (equal importance)	1	Very Low

Source: modified from Octavian et al. (2020; Susilo et al. (2019)

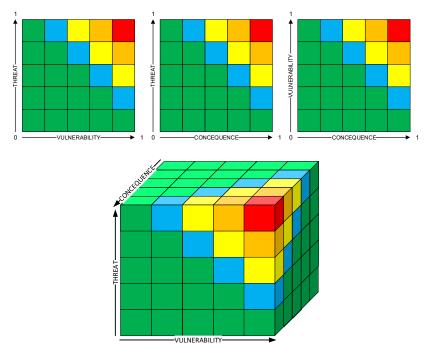


Fig. 2. 3D Risk model of risk analysis in Maritime Cybersecurity.

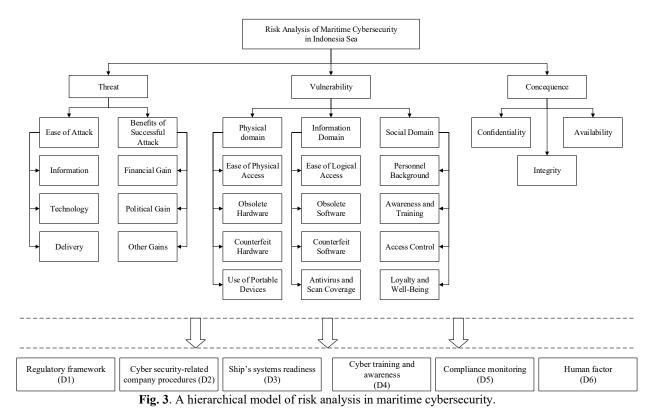
Modified from Amirshenava & Osanloo (2018); Crotty & Daniel (2022); Octavian et al. (2020); Yoo & Park (2021)

# 4. Result & Discussion

In this section, the proposed framework is used to identify maritime cybersecurity risks and map them in a risk matrix based on risk level values. The first step is to identify from the literature review the risk factors and dimensions of maritime cybersecurity in the event of a cyber attack. The second step is to measure, assess and map the Maritime Cybersecurity risk level.

# 4.1. Identification of criteria and Alternatives

Identification of criteria in maritime cybersecurity risk analysis was obtained from several previous studies, namely research from Jiang et al. (2023), Yoo & Park (2021), Gunes et al. (2021), and Ganin et al. (2017) as the main reference. The next step is to arrange a hierarchy by compiling objectives, criteria and alternatives. Preparation of criteria and sub-criteria for maritime cybersecurity risk analysis. As for alternatives, there are six dimensions of maritime cybersecurity literature from Alcaide & Llave, (2020); Kanwal et al. (2022); and Progoulakis et al. (2021) such as Regulatory framework (D1); Cybersecurity-related company procedures (D2); Ship's systems readiness (D3); Cyber training and awareness (D4); Compliance monitoring (D5); Human factors (D6).



Identification of influencing factors or criteria is carried out to determine risk analysis in maritime cybersecurity. Therefore, building a hierarchical structure serves to establish causal relationships between risk factors. Risk analysis in maritime cybersecurity has 3 (three) main criteria: Threat, Vulnerability, and consequence. Threat Criteria has 6 (six) sub-criteria; criteria, vulnerability consists of 12 (twelve) sub-criteria, and consequence consists of 3 (three) sub-criteria. The dimensional aspects of maritime cybersecurity consist of 6 (six) dimensions. All hierarchical factors are shown in Fig. 3.

# Table 6

Overall	priority	weight and	1 ranking	of crit	teria and	sub-criteria.
Overan	priority	worgin and	a ranking '		ioria and	sub-ontena.

Risk Criteria		<b>Evaluation Sub Criteria</b>	Weight (Prioritized)	Overall Weight (Prioritized)	Rank
Threat			0.4000	1st (Criteria)	
		Information	0.2166	0.0867	3
		Technology	0.2469	0.0988	1
		Delivery	0.0995	0.0398	12
		Financial Gain	0.1958	0.0783	4
		Political Gain	0.1152	0.0461	9
		Other Gains	0.1259	0.0503	8
Vulnerability			0.4000	2nd (Criteria)	
		Ease of Physical Access	0.3199	0.0399	10
- Physical domain		Obsolete Hardware	0.1287	0.0161	19
2	0.3119	Counterfeit Hardware	0.2314	0.0289	15
	0.1248	Use of Portable Devices	0.3199	0.0399	10
- Information Domain		Ease of Logical Access	0.3873	0.0760	6
	0.4905	Obsolete Software	0.1397	0.0274	16
	0.1962	Counterfeit Software	0.1981	0.0389	13
		Antivirus and Scan Coverage	0.2748	0.0539	7
- Social Domain		Personnel Background	0.2002	0.0158	20
	0.1976	Awareness and Training	0.1418	0.0112	21
	0.0790	Access Control	0.3290	0.0260	17
		Loyalty and Well-Being	0.3290	0.0260	17
Consequences			0.2000	3rd (Criteria)	
		Confidentiality	0.3873	0.0775	5
		Integrity	0.1698	0.0340	14
		Availability	0.4429	0.0886	2

After compiling the section on the importance of key factors influencing a valid questionnaire, C.I. value 0.02, and value C.R. is 0.023 for the 3 main criteria and 21 assessment sub-criteria, indicating that a valid questionnaire meets the

consistency standard. The relative importance of the key factors influencing risk analysis in maritime cybersecurity (MCS) is shown in Table 6. Results of the AHP methodology in this study reveal that threat and vulnerability criteria are important aspects (40%), while consequence aspects of 20%. Furthermore, of the 21 assessment sub-criteria, there are five of the most important sub-criteria, namely Technology (9.8%), Availability (8.8%), Information (8.6%), financial gain (7.8%), confidentiality (7.7%). The most influential sub-criteria in the risk analysis comes from the threat and consequence criteria. These aspects are correctly identified because they are a challenge for policymakers in Indonesia's marine areas in maintaining maritime cybersecurity.

### 4.2. Risk Analysis on Maritime Cybersecurity

After establishing the weighting of the risk assessment criteria, a questionnaire selection scheme was compiled from a risk analysis of the six dimensions of maritime cybersecurity to provide an assessment of the threat, vulnerability, and consequence aspects with the positive ideal solution and the farthest from the negative ideal solution, the most appropriate in order of priority using an index scale of 5 steps all variables reach the maximum value.

D+	D-	Result	Rank	Level
0.027	0.023	0.455	5	Moderate
0.023	0.031	0.567	3	Moderate
0.027	0.026	0.492	4	Moderate
0.036	0.021	0.368	6	Low
0.020	0.030	0.605	2	High
0.019	0.037	0.661	1	High
	0.027 0.023 0.027 0.036 0.020	0.027         0.023           0.023         0.031           0.027         0.026           0.036         0.021           0.020         0.030	0.027         0.023         0.455           0.023         0.031         0.567           0.027         0.026         0.492           0.036         0.021         0.368           0.020         0.030         0.605	$\begin{array}{c ccccccccccccccccccccccccccccccccccc$

Table 7

Based on Table 7, it shows that in the threat aspect among the six dimensions, there are two dimensions at the High level, namely Compliance monitoring (D5), Human factor (D6) with a closeness coefficient of 0.605 and 0.661 respectively. Furthermore, there are three dimensions at the moderate level, namely Regulatory framework (D1), Cyber security-related company procedures (D2), Ship's systems readiness (D3) with each proximity coefficient of 0.455, 0.567, 0.492. There is one dimension in the Low category, namely Cyber training and awareness (D4) with a coefficient of 0.368. Thus, the highest threat aspect is in Compliance monitoring (D5), Human factor (D6). On average, the threat aspect is at a moderate level with a value of 0.525.

### Table 8

Risk analysis value of vulnerability aspect.

Alternative	D+	D-	Result	Rank	Level
D1	0.022	0.020	0.486	3	Medium
D2	0.010	0.030	0.742	2	High
D3	0.027	0.019	0.415	6	Medium
D4	0.023	0.017	0.419	5	Medium
D5	0.022	0.019	0.461	4	Medium
D6	0.007	0.031	0.809	1	Very High
		Average Level	0.555		Medium

Table 8 shows that in the aspect of vulnerability among the six dimensions, there is one dimension at the Very High level, namely the Human factor (D6) with a proximity coefficient of 0.809. The Cyber security-related company procedures (D2) dimension is at the High level of 0.742. Furthermore, there are 4 dimensions at the medium level, namely Regulatory framework (D1), Ship's systems readiness (D3), Cyber training and awareness (D4), Compliance monitoring (D5) with each proximity coefficient of 0.486, 0.415, 0.419, 0.461. Thus, the highest vulnerability aspect is in the Human factor (D6). On average, the vulnerability aspect is at a medium level with a value of 0.555.

Table 9	
Risk analysis	value of consequence aspect

Alternative	D+	D-	Result	Rank	Level
D1	0.030	0.027	0.472	4	Moderate
D2	0.006	0.043	0.875	1	Catastrophic
D3	0.038	0.012	0.233	6	Marginal
D4	0.026	0.028	0.523	3	Moderate
D5	0.010	0.039	0.799	2	Critical
D6	0.032	0.028	0.467	5	Moderate
	Moderate				

Table 9 shows that in the consequence aspect among the six dimensions, there is one dimension at the Catastrophic level, namely Cyber security-related company procedures (D2) with a coefficient value of 0.875. one dimension is Critical level,

namely Compliance monitoring (D5) with a coefficient value of 0.799. One dimension at the Marginal level, namely Ship's systems readiness (D3) of 0.233. then three dimensions are at a moderate level, namely Regulatory framework (D1), Cyber training and awareness (D4), and Human factors (D6) with each proximity coefficient of 0.472, 0.523, 0.467. On average, the consequence aspect is at a moderate level with a value of 0.562.

### Table 10

Dimension	Т	V	С	Risk Score	Risk Level
D1	0.455	0.486	0.472	0.104	Very Low
D2	0.567	0.742	0.875	0.368	Low
D3	0.492	0.415	0.233	0.048	Very Low
D4	0.368	0.419	0.523	0.081	Very Low
D5	0.605	0.461	0.799	0.223	Low
D6	0.661	0.809	0.467	0.250	Low

The final step of the criterion risk analysis is determining a reference value to determine the final level of risk. The level of risk is determined by three variables, namely threat (T), vulnerability (V), and consequence (C). Based on this, a 3D model should be used to describe the level of risk. The associated values are determined by a team of experts.

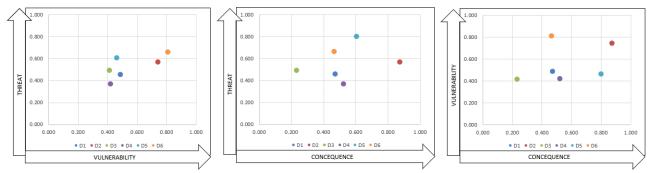


Fig. 4. Results of risk analysis on the 3D Matrix for maritime Cybersecurity.

In Table 10 and Fig. 4, based on the risk calculation results, of the six dimensions of maritime cybersecurity in Indonesia, there are dimensions at Very Low and Low Risk levels. Three MCS dimensions with Low levels are Cyber security-related company procedures (D2), Compliance monitoring (D5), Human factor (D6) with respective risk values of 0.368, 0.223, 0.250. Three other MCS dimensions with very low levels are Regulatory framework (D1), Ship's systems readiness (D3), Cyber training and awareness (D4) with respective risks of 0.104, 0.048, 0.081. The highest risk value is obtained by the Cyber security-related company procedures (D2) dimension and the lowest risk value is Ship's systems readiness (D3). Overall, the risk of attacks on MCS in the Indonesian Sea area is still in the Low category.

Risk management on MCS in Indonesia's sea area mine closure plays an important role in safeguarding activities from and through the sea in line with the vast area of Indonesia which is mostly sea by the dimensions of MCS. In this regard, a risk management approach to maritime Cybersecurity is developed based on a 3D risk model as well as a robust hybrid decision support system, which is developed and implemented for each maritime activity with some modifications to the risk factors and alternative dimensions of MCS applied, based on the specific conditions related to the national marine area conditions. Developing a 3D risk assessment model based on the three factors of threat, vulnerability, and consequences as one of the most important features is considered an advantage of this approach, compared to other similar studies. The results of the AHP and TOPSIS methods in the case study show that the methods are compatible. In other words, the selection of these methods is correct and the most suitable choice.

# 5. Conclusion

This research uses a 3D risk analysis management developed to investigate the dimensions and risk assessment analysis of maritime cybersecurity in Indonesia's marine areas. The risk assessment approach based on AHP and TOPSIS-based 3D risk matrix becomes a practical and efficient tool to evaluate and rank the risks of MCS dimensions. This framework makes it possible to balance and compare risks associated with maritime cybersecurity elements, as well as to create a database, supplementing it with factual figures to achieve several subcriteria (21 subcriteria in total) and comparison relationships. The ability to adopt new models in the MCS is considered another advantage of the risk analysis approach.

The results of applying this framework to the Indonesian marine domain showed effectiveness compared to 2D risk models. In terms of risk factors, the results of this study show that there are five most important sub-criteria, namely Technology (9.8%), Availability (8.8%), Information (8.6%), financial gain (7.8%), confidentiality (7.7%). The most influential sub-criteria in risk analysis comes from the threat and consequence criteria. Based on the results of the 3D risk analysis, six

MCS dimensions were identified as having risk levels at Very Low and Low Risk levels. The highest risk value is obtained by the Cyber security-related company procedures (D2) dimension (0.368) and the lowest risk value is Ship's systems readiness (D3) (0.048). Overall, the risk of attacks on MCS in the Indonesian Sea area is still in the Low category.

This research has real implications for qualitative analysis of cyber risk management aspects in the maritime domain in Indonesia's maritime region, with technological sophistication increasing every year and increasing risks and threats to the maritime cybersecurity dimension. This research will assist stakeholders in evaluating and developing a 3D model-based maritime cybersecurity risk value framework as a first step in determining policy strategies by adopting the solutions provided in the research. This framework not only helps state actors to identify their capabilities from an objective perspective but also to compare them with their competitors to gain insights to improve competitive advantage.

There are several limitations in the study. First, a cost-benefit analysis should be conducted after selecting a risk treatment option to improve the efficiency of the proposed approach as a key direction for future research. This study did not address this. Second, to ensure a thorough assessment procedure, future research should consider additional selection criteria as well as other evolving dimensional models of MCS including individual, organizational, and policy actors. Future research can assess the feasibility of these alternatives. Third, risk management in MCS is dynamic by the development of the strategic environment, the research did not discuss the direction of risk management sustainability in the MCS dimension, future research can provide simulation-based sustainability analysis.

### Acknowledgement

This research is supported by research from Indonesia Defense University. We also deliver our gratitude to maritime stakeholders who made important contributions to this research.

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