



# Article Seaport Terminals Risks Prioritization Using a Structural Modeling-Based Approach: A Real Case Study

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Abstract: Port risk management (PRM) during port operations is a current problem that can negatively affect the environment, people, and economic issues. In the literature, there is an enormous amount of research related to supply chain risk management (SCRM) in various areas and with various objectives. However, PRM has not received the same degree of attention. In fact, port terminals are crucial links in most supply chain networks and an important pillar of international trade. Therefore, for better risk mitigation efficiency, a risk assessment and prioritization step are vital. Recently in the literature, researchers have applied prospective methods such as structural analysis methods to risk prioritization in SCRM. The aim of this research is to prioritize various man-made risk variables in PRM using a qualitative structural modeling-based approach, specifically, the MICMAC method (referring to its French acronym: Matrice d'Impacts Croisés Multiplication Appliquée à un Classement). An empirical study was conducted to assesses and prioritize risk variables of the seaport terminals of Sfax (Tunisia). The main contributions of the empirical research are twofold. First, to prioritize the key risk variables to define the most critical ones that require immediate intervention. Second, to analyze the structure of the influences between all identified risk variables. The results for the port terminals of Sfax show that the highest-priority risk variables are the manual handling (Ph3), disregard for safety aspects (Ph4), unsafe storage of goods (Inc1), absence of a prevention system and a rescue organization (Inc2), neglect of the regulatory aspects of handling equipment (M1), ignorance of good handling practices during the operation of loading and unloading (Cho2), and inadequate lifting accessories (Cho3). These risk variables must be the subject of urgent risk reduction strategies.

**Keywords:** structural analysis method; port terminal; port risk management; MICMAC method; risk assessment; risk prioritization; Sfax port terminals; Tunisia

# 1. Introduction

The performance of the supply network can be influenced by numerous disturbing risks that affect all items, administrations, and data between stakeholders. Management of these risks is known as supply chain risk management (SCRM) [1]. There are many classifications of SCRM proposed in the literature. The comment and recent one is about classifying risk sources into three groups: (i) internal to the firm, (ii) external to the firm but internal to the supply chain, and (iii) external to the supply chain. Risks can also be categorized into many types under these three groups, such as demand side, process side, supply side, etc. [2].

Therefore, in the literature, there is an enormous amount of research related to SCRM in various areas and with various objectives. However, port risk management (PRM) has not received the same degree of attention [3]. However, port terminals and seaports are vital links in supply chain networks. Seaports are positioned as an important pillar of



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**Copyright:** © 2022 by the authors. Licensee MDPI, Basel, Switzerland. This article is an open access article distributed under the terms and conditions of the Creative Commons Attribution (CC BY) license (https:// creativecommons.org/licenses/by/ 4.0/). international trade. In seaport terminals, many sources of risk can be triggered by various threats. It is better to classify them into two main risk groups: natural and man-made risk groups [4]. In this manuscript, only man-made risk is considered. In fact, man-made risks occur mainly as a consequence of one or more intentional or negligent human actions. Moreover, risks can be classified into different groups, including operational, technical and technological, organizational, and environmental [5].

SCRM can be studied differently and more specifically to identify the most critical risk is the use of the prospective methods such as structural analysis methods such as the Interpretive Structural Modelling (ISM) method, Matrice d'impacts croisés multiplication appliquée à un classement (which refers to its French acronym, MICMAC) method [6–8], the MACTOR (Matrix of Alliances and Conflicts: Tactics, Objectives, and Recommendations) method [9], the morphological approach [10], etc. For example, Hachicha and Elmsalmi [6] proposed an integrated approach based on structural modeling for risk prioritization in the supply network management of the food industry.

Jha and Devaya [7] present the international construction chance elements of the attitude of Indian production experts in a comprehensive format to enable them to prioritize efforts to manage the hazard elements. Additionally, Pfohl et al. [8] classify the risks of the supply chain and validation of the approach through two case studies. Pandey and Sharma [11] present an interpretive structural modelling approach based on FMEA to model the automotive supply chain risk.

In fact, structural analysis is a method that allows one to identify key variables in a studied system. This method gives an exhaustive representation of the system and makes it possible to reduce its complexity to essential variables. According to Godet et al. [12], structural analysis is 'a method of structuring a collective reflection, the chosen project of which can be considered as a system and can be defined as a set of elements in interaction'. In this vein, Maruster and Gijsenberg [13] consider that the structural analysis is made by a working group made up of participants and experts in the field concerned, but this does not exclude the intervention of an external "board". The previous results that mention the influence and dependence of each variable can be represented on a plane (the x axis corresponding to the dependence and the y axis to the influence). Besides identifying the most influential variables of the system studied, we can thus focus on the different roles of the variables in the system, of which the following plan presents a typology.

## 1.1. Literature Review

Port cities are hazardous areas because of the diversity and intensity of the activities carried out and the amount of dangerous goods that transit through the ports. Port disasters, although not common, are part of the reality of port cities. For example, we can cite the explosion of the Sembla silos in the Port Autonome of Bordeaux on 20 August 1997, which caused 11 deaths and 1 serious injury. On 26 August 1972, the Greek oil tanker "Princess Irene" was the subject of a disaster. The explosion occurred in the port of Sri Lanka, killing 6 people [5]. Further examples include SEVESO in Italy 1976 [14], Chernobyl in Ukraine 1986 [15], and the recent Beirut port terminal disaster in 2020 [16], etc. It should be noted that, recently, many dangerous goods terminals have been moved outside cities as a solution to eliminate some risk variables. It seems that is not a sustainable solution. The port situation can return to the same with urban extension.

Therefore, some of the work has studied the problem of PRM. Smari and Noumen [17] compiled a comprehensive list of possible risks for PRM in container terminals and compared them with the risks identified in the Tunisian context. Their method of risk identification is based on qualitative interviews with practitioners and the existing literature and port data. Pallis [18] presented a review of different approaches to specifically quantify risk in the container terminal. Wiegel et al. [19] described a method of global mapping of seaport operability risk indicators using open-source ocean weather data. John et al. [20] proposed a novel fuzzy chance evaluation approach to facilitate the remedy of uncertainties in seaport operations and to optimize its overall performance effectiveness. Nagi et al. [4]

detected communities of stakeholders at the port of Hamburg regarding their communication intensity in activities related to risk management. Pileggi et al. [21] proposed an ontology (CoRiMaS) that implements a developed reference model for risk management explicitly aimed at seaports with a cooperative approach to risk management. Ding and Tseng [22] evaluated safety operations in exclusive container terminals at the Kaohsiung port in Taiwan using a fuzziness-based method. Wan et al. [23] identified the main risk factors that influence the safety and security of maritime container supply chains (MCSCs) using the risk classification framework, which incorporates a Delphi survey and a risk matrix approach. The risk elements in [23] are quantitatively evaluated with respect to their probability of occurrence and severity of the effect and include five points of view: society, natural environment, management, infrastructure and technology, and operations. Bellsolà et al. [24] proposed a new methodology to assess nautical risks in ports based on the knowledge of navigators and risk experts. They have quantified the risk in different areas of any port using a proposed nautical port risk index.

Loh and Thai [25] introduced a port-centric supply chain disruption (PSCD) model that incorporates the application of risk management, business continuity management, and quality management theories with the objective of increasing port resilience to improve supply chain continuity. Loh et al. [26] studied the role of ports in supply chain disruptions through the establishment of the portfolio of each PSCD threat based on data collected from port operators and port users worldwide. John et al. [27] presented a risk assessment approach to improve the resilience of a seaport system using Bayesian networks.

Based on this review of the literature, two main statements have been concluded. First, PRM research has a huge scope and covers numerous extraordinary elements, including risk factors, hazard assessment, disaster response planning, empirical information, and frameworks. However, in a few cases, the contributing authors expand very specific methods relevant to particular ports. Second, the previously proposed methods do not take into account the complexity, dynamics, and unpredictability of risk management problems and are limited to the case of arrivals of containers intended exclusively for import or export. There is a lack of experimental studies on the case of risk reduction after the departure and arrival of containers. Most of the works related to ports in the world do not significantly address the problem of risk management during port operations. The use of structural analysis methods in PRM is rarely addressed. However, these methods have been widely studied in SCRM, especially during risk assessment and prioritization.

#### 1.2. Objective of the Study

In the literature, there is an enormous amount of research related to supply chain risk management (SCRM) in various areas and with various objectives. However, PRM have not received the same degree of attention. However, port terminals are crucial links in most supply chain networks and are an important pillar of international trade. Therefore, for better risk mitigation efficiency, a risk identification and prioritization step are vital. The main research question discussed in this study is about how to prioritize various manmade risk variables in PRM using a qualitative structural modeling-based approach and precisely the MICMAC method. An empirical study was conducted to identify, evaluate, and prioritize risk variables of the Sfax port terminals (Tunisia). This port studied is a medium-sized one. The types of vessels that regularly call in this port are general cargo, bulk carrier, container ship, oil/chemical tanker, fishing, etc.

Input data of the study are collected based on the literature review and experts' opinions in the field. After that, the MICMAC method is applied to understand the direct and indirect relationships between these identified risk variables and to determine the most prioritized and fundamental risk variables of them.

### 2. Materials and Methods

## 2.1. MICMAC Method

The MICMAC method was developed in 1971 by Michel Godet [12]. The application of this method was made on the Micmac software. This software is developed by the French Institute of Computer Innovation for the Enterprise. Ocampo et al. [28] define MICMAC as a matrix multiplication program applied to the structural matrix, which allows us to study the propagation effect of the reaction paths and circuits, so that the variables are consistent: by influence order prioritize the variables. The MICMAC method allows to prioritize all the possible factors according to their influence, dependence and indirectness. It is based on the properties of matrix calculation.

There are three steps in MICMAC analysis: (1) all possible variables that characterize the studied system (internal and external variables) are listed. (2) a description of the relationships between each pair of variables is made. For each pair of variables, the following question is posed. Is there a direct influence relationship between variable i and variable j? The response is a score of 0 to 3. The value 0 indicates the absence of influence; 1: Low influence; 2: medium influence; 3: High influence. (3) the identification of the most important variables which are essential to the evolution of the system. The classification is obtained after increasing the power of the matrix. The comparison of the hierarchy of variables within the exclusive classifications (direct, indirect) is instructive. It makes it viable to confirm the importance of certain variables [29].

All identified variables are categorized into four different quadrants: quadrant of autonomous variables, quadrant of influent variables, quadrant of dependent variables, and quadrant relay variables. First, autonomous variables are characterized by both weak dependence and week influence. All autonomous variables are excluded from the risk analysis. Second, influent variables are characterized by a high influence and low dependence. They considered them as input variables of the system studied. Third, dependent variables are characterized by a low influence and high dependence. They considered them as output variables of the system studied. Finally, the relay variables are characterized by high influence and high dependence. They considered at the same time as the input and output variables of the studied system. These variables are the most critical variables of the studied system.

The objective of the MICMAC method includes the following: (1) systematically analyze the influence of each risk variable on the others; (2) identify the indirect relationships between the risk variables; and (3) then rank these variables according to their degree of influence and dependence.

The MICMAC method has been applied in various area to study the most important factors of a complex systems. Very recent applications in the literature have been noted, such as in civil engineering [29], risk management [1,10,30], etc., supply chain management [31], manufacturing management [32,33], etc.

#### 2.2. The Proposed Approach

The purpose of this research is to prioritize various man-made risk variables in PRM using a qualitative structural modeling-based approach and precisely the MICMAC method. An empirical study was conducted to assesses and prioritize risk variables of the seaport terminals of Sfax (Tunisia).

The studied port was established in 1894 and is one of the main pillars of the Tunisian economy, thanks to its openness to international trade. The Sfax port is a medium-sized one. The types of vessels that frequent this port are general cargo, bulk carrier, container ship, oil/chemical tanker, fishing, etc. With its multipurpose mooring, the port has 13 stations and can actually accommodate 11 ships simultaneously, depending on the size of the vessel.

The flow chart of the proposed approach is presented in Figure 1. First, The MICMAC method requires a taxonomy of risk factors related to port operations in order to identify port risk variables according to their influence and dependence and to highlight key risk

variables. Second, the reachability matrix is introduced as an input to the MICMAC method. Third, the indirect influence matrix and the direct and indirect displacement map are obtained as an output of the MICMAC method.

The main contributions of the empirical research are twofold. First, prioritize the key risk variables to define the most critical ones that require immediate intervention. Second, to analyze the structure of the influences between all identified risk variables.

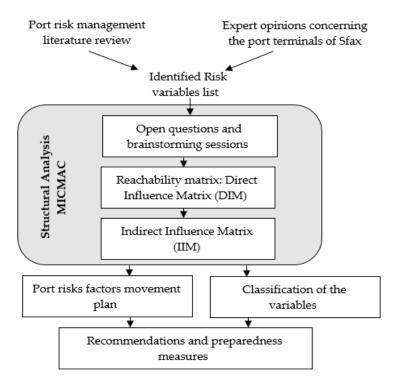


Figure 1. Flowchart of the proposed approach.

#### 3. Results

## 3.1. Identification of Risk Variables

The taxonomy of risk variables was carried out with the help of experts involved in the port. The main objective of the interviews and group work at the Sfax port terminals is to identify all risk variables. The 26 risk-adjusted variables are presented in Table 1. These experts have been chosen according to their experiences in the port of Sfax.

Table 1.	The list o	f risk varia	bles ident	tified in	Sfax seaport.
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Category	Num.	Code	Risk Variables
	1	(CI1)	Poor workplace design.
Internal	l 2 (CI2) materia	Lack of signage for the circulation of various flows (pedestrians, carts, materials, etc.).	
organization	3	(CI3)	Absence of plan, instruction, traffic display
	4	(CI4)	Defective and uneven floor.
	5	(C1)	Improper handling of chemicals.
Chemical hazards	6	(C2)	Absence of a Safety Data Sheet (SDS) for the goods.
	7	(C3)	Not wearing the EPI (gloves, mask, $\dots$ ) by the workers exposed to the risk

Category	Num.	Code	Risk Variables					
	8	(Cho1)	Instability and poor stowage of goods.					
Failing objects	8	(Cho2)	Ignorance of good handling practices (slinging of the goods) during the operation of loading and unloading.					
rannig objects	10	(Cho3)	Inadequate lifting accessories. (Chains, slings, ropes, shackles, hooks, lifting straps) and non-compliance with the regulatory aspects of Tunisian decree 62-129 (periodic inspection required).					
	11	(EL1)	Lack of training for electricians.					
	12	(EL2)	Lack of work equipment and personal protective equipment (PPE).					
Electrical hazards	13	13 (EL3) Faulty electrical installation.						
	14	(EL4)	Neglect of regulatory aspects (periodic inspection).					
	15	(M1)	Neglect of the regulatory aspects of handling equipment (periodic inspection).					
	16	(M2)	Lack of lighting (Visual management).					
Machine risks	17	(M3)	Lack of supervision.					
	18	(M4)	Falling from heights (of drivers: forklift operators, crane operators, ), lack of instruction (climbing down ladder).					
	19	(Inc1)	Unsafe storage of goods (no-respect of thermal flows, domino rule, bow tie,).					
Fire, explosions and paric	20	(Inc2)	Absence of a prevention system and a rescue organization (prevention certificate, first intervention team, emergency exit, assembly point, ).					
	21	(Inc3)	Neglect of the regulatory aspects (the requirements of the safety code and prevention of fire, explosion and panic risks).					
	22	(Ph1)	Poor layout of workstations.					
	23	(Ph2)	Lack of training					
Physical hazards	24	(Ph3)	Manual handling.					
i nysitai nazarus	25	(Ph4)	Disregard for safety aspects (lack of procedures, instructions, supervision, roles and responsibilities, job description).					
	26	(Ph5)	Poor posture and physical condition.					

Table 1. Cont.

## 3.2. MICMAC Matrix

The direct influence matrix describes the direct influence relationships between the risk variables that define the risk management system (PRM) (see Figure 2), as this matrix is filled in by the experts involved in the port with intensities rated from 0 to 3. The value 0 indicates the absence of influence; 1: low influence; 2: medium influence; 3: high influence.

All values in Figure 2 are assigned after a compromise between the three experts during brainstorming sessions. It should be noted that all values of the diagonal of the matrix of Figure 2 are equal to zero because it assumed that there is no influence between a risk variable with itself. For the first example, experts determined that poor workplace design (CI1) has a low influence on the (CI2) lack of signage for the circulation of various flows. For a second example, a lack of training (Ph2), disregard for safety aspects (Ph4), and lack of supervision (M3) have the highest influence (a weight of 3 is assigned) on all other risk variables except with itself.

It should be noted that the sum of each row of the matrix (Figure 2) corresponds to the direct influence of each variable, and the sum of each column corresponds to the direct dependence.

	1:01	2:CI2	3: CI3	4 : CI4	5:C1	6:C2	7:C3	8 : Cho1	9 : Cho2	10: Cho3	11 : EL1	12:EL2	13:EL3	14:EL4	15 : M1	16:M2	17 : M3	18:M4	19 : Inc1	20 : Inc2	21 : Inc3	22 : Ph1	23 : Ph2	24 : Ph3	25 : Ph4	26 : Ph5	
1 : CI1	0	1	3	0	3	0	0	3	1	3	0	1	2	0	2	3	0	3	3	3	2	3	0	3	0	2	
2 : CI2	3	0	3	2	3	0	1	3	3	3	0	1	2	0	2	1	1	3	3	3	3	2	0	2	0	1	
3 : CI3	3	3	0	3	0	0	3	0	2	0	0	1	2	1	3	2	1	3	3	3	3	3	0	2	1	1	
4 : CI4	3	1	1	0	3	0	0	3	0	2	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	
5:C1	3	3	3	3	0	2	0	1	3	3	0	3	0	2	1	0	1	0	3	0	1	2	1	0	2	2	
6:C2	0	0	0	1	3	0	2	1	2	1	0	2	0	3	1	0	0	0	3	1	3	0	1	1	2	1	
7:C3	0	0	0	0	3	1	0	3	2	1	0	2	0	2	0	0	2	3	1	1	0	0	1	1	2	3	
8:Cho1	2	3	2	2	2	3	1	0	0	2	3	0	0	2	1	0	1	3	3	3	1	1	0	2	1	3	
9:Cho2	2	3	2	0	3	3	3	3	0	3	0	3	0	3	3	1	2	3	3	3	3	0	3	3	3	3	
10:Cho3	2	2	2	0	3	3	2	3	2	0	0	3	0	2	3	2	2	2	3	1	1	2	3	3	3	2	
11 : EL1	0	0	0	0	2	0	0	0	1	1	0	0	3	3	3	3	0	3	3	3	3	1	3	3	3	2	
12 : EL2	0	3	3	0	3	2	3	3	3	3	3	0	3	2	3	3	3	1	1	0	3	0	3	3	3	0	
13 : EL3	3	3	3	3	3	1	1	3	2	1	1	3	0	2	2	3	2	3	3	2	2	1	3	3	3	0	
14 : EL4	3	3	3	3	3	3	3	3	3	3	3	3	3	0	3	3	3	3	3	3	3	3	3	3	3	3	
15:M1	3	3	3	2	3	3	3	3	3	3	3	3	3	2	0	2	3	2	2	3	3	1	3	3	3	3	
16:M2	3	1	1	2	3	2	1	3	3	1	3	1	3	3	3	0	3	3	3	3	3	3	3	3	3	3	
17:M3	3	3	3	3	3	3	3	3	3	3	3	3	3	3	3	3	0	3	3	3	3	3	3	3	3	3	
18:M4	1	1	1	2	1	1	1	2	2	2	2	1	1	1	2	1	1	0	2	2	2	2	2	2	2	2	
19 : In c1	3	2	2	2	3	2	2	3	3	2	3	3	3	3	3	2	3	3	0	3	3	2	3	3	3	3	ē.
20 : ln c2	3	3	3	0	2	3	2	3	3	2	2	2	2	3	3	2	3	3	3	0	0	3	0	0	0	0	<b>IPSOR</b>
21 : In c3	3	3	3	2	2	3	3	3	2	3	3	3	3	3	3	2	3	3	3	3	0	3	3	3	3	3	
22 : Ph1	3	3	3	3	3	2	3	3	2	3	3	3	3	3	3	3	3	3	3	2	3	0	3	3	3	3	문
23 : Ph2	3	3	3	3	3	3	3	3	3	3	3	3	3	3	3	3	3	3	3	3	3	3	0	3	3	3	¥.
24 : Ph3	3	0	0	2	3	3	0	3	3	3	0	3	0	3	3	2	0	3	3	0	3	3	3	0	3	3	ŝ
25 : Ph4	3	3	3	3	3	3	3	3	3	3	3	3	3	3	3	3	3	3	3	3	3	3	3	3	0	3	EPITA-MICMAC
26 : Ph5	3	0	0	1	3	0	0	3	3	3	2	0	0	0	3	0	0	1	3	0	3	3	0	3	3	0	0

Figure 2. Reachability matrix (Direct Influence Matrix).

## 3.3. MICMAC results

The analysis of the direct/indirect displacement map (Figure 3) shows a certain number of changes in the classification of the variables, both at the level of dependence and at the level of motor skills. The classification change of the variables represents the variation in positions of the variables between their initial ones (Plan of Direct Influences/Dependencies) and final ones (released from the Plan of Influences/Indirect Dependencies). This implies the advantage of highlighting the appreciation of hidden risk variables by considering their indirect influences.

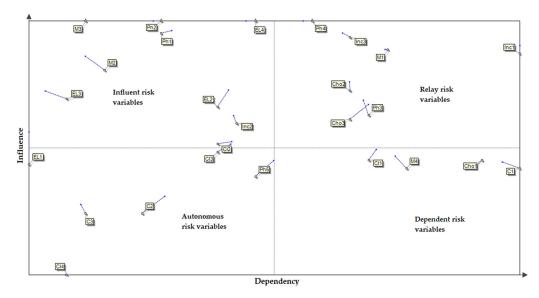


Figure 3. The direct and indirect displacement map.

The displacement map of direct and indirect influences/dependencies shown in Figure 3 is an output of the MICMAC software and presents the risk variables on a dependence plan influenced by the dependence on the X-axis and the influence on the Y-axis. The factors are plotted on the plan according to the strength of their influence and dependence on the indirect influence matrix (IIM). The IIM is the matrix that resulted from incorporating all the transitivity from the original direct influence matrix (DIM) that comprised the input data for the program (Figure 2) also named the reachability matrix. The projection of the risk variables into the direct/indirect movement plan shows that:

- The input or influential variables, located to the northwest are: M3 (lack of supervision), EL4 (neglect of regulatory aspects (periodic inspection)), EL2 (lack of work equipment and individual protection equipment (EPI)), M2 (lack of lighting (visual management)), Ph1 (bad arrangement of the stations), Ph2 (lack of training) and EL3 (faulty electrical installation). These are highly influential variables and are less dependent than the other variables in the PRM system. They are also explanatory variables of the system under study and are the most crucial elements. These variables cannot be controlled.
- The relay variables are highly influential and highly dependent variables: Inc3 (neglect of regulatory aspects: the requirements of safety code and prevention against fire, explosion, and panic risks), Ph3 (manual handling), Ph4 (disregard of safety aspects (lack of procedures, instructions, supervision, roles and responsibilities, job description), Inc1 (unsafe storage of the goods (non-respect of thermal flows, domino rule, bow tie, etc.), CI3 (neglect of the EPI (gloves, mask, etc.) by the workers exposed to the risk (absence of discipline), ChO2 (ignorance of the good practices of handling (slinging of the goods) during the operation of loading and unloading), ChO3 (inadequate lifting accessories (chains, slings, ropes, shackles, hooks, lifting straps) and noncompliance with the regulatory aspects of the Tunisian Decree 62–129 (periodic inspection required)) and M1 (neglect of the regulatory aspects of handling equipment (periodic inspection).
- The outcome or dependent variables are both weakly influential and highly dependent. The evolution of these variables is explained by the evolution of the input and relay variables. These are the output variables of the PRM system: CI1 (poor layout of the workplaces), M4 (fault from heights (of drivers: forklift operators, crane operators, etc.), ChO1 (instability and bad storage of the goods), C1 (poor handling of chemicals), etc.
- The autonomous variables are variables with little influence and little dependency. They have little impact on the evolution of the PRM system: CI4 (deficient and irregular ground), C2 (absence of a Safety Data Sheet (SDS) for the goods), C3 (no wearing of the EPI (gloves, mask, etc.) by workers exposed to the risk (absence of discipline).
- The platoon variables are more influential in the medium than the dependent variables. It is not possible to determine their role in the PRM system: CI2 (lack of signage of the aisles of circulation of various flows (pedestrians, carts, materials, etc.), EL1 (lack of training for electricians), CI3 (absence of plan, instruction, traffic display), Ph5 (poor posture and physical condition).

MICMAC method incorporates all levels of transitivity. If "M" denotes the initial reachability matrix (named also, Direct Influence Matrix) shown in Figure 2, then " $M^{2}$ " provides the second levels of transitivity, " $M^{3}$ " provides the third levels of transitivity, and so on. Each matrix  $M^k$  (k > 1) represents an indirect influence matrix of order k, which provides a new hierarchy among variables when certain power convergences are met (generally 5 or 6). That means that the same hierarchy remain unchanged [12,34].

Table 2 presents another output to the MICMAC software, showing the numerical weights of the risk variables for direct and indirect for both influence and dependence. The numerical values in Table 2 allow us to have a classification of the variables according to their influences and their decreasing dependences (direct and indirect). Note that these numerical values are normalized.

For example, the neglect of regulatory aspects (EL4) is ranked as first for direct influence and is ranked twelfth for direct dependency. For indirect score, EL4 remains first for indirect influence, and its rank for indirect dependency becomes thirteenth.

Rank	Label	Direct Influence	Label	Direct Dependency	Label	Indirect Influence	Label	Indirect Dependency
1	EL4	553	C1	486	EL4	541	Inc1	484
2	M3	553	Inc1	486	M3	541	C1	477
3	Ph2	553	Cho1	471	Ph2	541	Cho1	467
4	Ph4	553	M4	442	Ph4	541	M4	436
5	Ph1	530	M1	435	Ph1	523	M1	433
6	Inc3	523	CI1	427	Inc3	518	CI1	429
7	M1	501	Ph3	427	Inc1	496	Cho3	426
8	Inc1	494	Cho2	420	M1	488	Ph3	424
9	M2	464	Cho3	420	M2	476	Cho2	419
10	Cho2	427	Inc3	420	Cho2	430	Inc3	416
11	EL3	412	Ph4	405	EL2	414	Ph4	401
12	EL2	398	EL4	383	EL3	413	Ph5	390
13	Ph3	383	Ph5	383	Ph3	395	EL4	380
14	Cho3	376	Inc2	376	Cho3	388	Inc2	375
15	Inc2	368	CI2	368	Inc2	368	CI2	374
16	CI2	331	CI3	368	EL1	337	CI3	374
17	CI3	317	EL2	368	CI2	319	EL2	373
18	CI1	302	Ph1	346	CI3	315	Ph1	351
19	Cho1	302	Ph2	346	CI1	306	C2	349
20	EL1	294	C2	339	M4	293	Ph2	344
21	C1	287	M2	324	Ph5	285	M2	318
22	M4	287	C3	317	C1	283	M3	318
23	Ph5	272	M3	317	Cho1	275	C3	317
24	C2	206	CI4	309	C2	219	CI4	311
25	C3	206	EL3	309	C3	205	EL3	303
26	CI4	95	EL1	294	CI4	76	EL1	297

Table 2. Numerical weights of the studied risk variables.

Through the MICMAC analysis, all these variables are important, whether they have strong influences and strong dependencies (relay variables) or they have a very high influence. The highest priority risk variables, Ph3, Ph4, Inc1, Inc3, M1, Cho2, Cho3, are the most critical variables and must urgently be the subject of risk reduction strategies in the port of Sfax. Moreover, managers should not neglect the variables {EL4, Ph2, M3, and Ph1} in view of their higher influences.

#### 4. Discussion

After risk prioritization, the primary work to carry out is to find effective risk mitigation strategies from the identified risks. However, it is important to note that these measures must be taken by all the players in the port logistics chain, who must each collaborate on their own and respect their duties. Adequate preparedness measures are suggested:

- Respect of general obligations of the competent authority of the flag state:
- Respect of general obligations and responsibilities of ship owners: The ship owner is primarily responsible for the safety and health of all seafarers on board ships. However, the daily duty rests with the captain who has to adhere to the reporting approaches set through ship owners. These should establish an adequate seafarer health and safety policy, under the law national and international, and provide the means necessary for the execution of these policies. The policy and software must set out the obligations of all parties, such as shore employees and contractors. Ship owners should offer and keep or replace vessels, gadget, units, manuals, and other files, and prepare all coaching and sports in the sort of way that, to the fullest extent possible, seafarers are

not exposed to any chance of twist of fate or damage. The planning, preparation, and implementation of activities should take the following requirements: (1) All dangers that may arise on the port must be avoided. (2) Excessively or unnecessarily painful working postures and movements must be avoided. (3) The organization of work must consider the safety and health of the sea worker. (4) The materials and products used must be safe and do not endanger the health of seafarers. (5) The working methods employed must ensure the protection of seafarers against the harmful effects of chemical, physical, and biological agents. (6) Shipowners should take a look at the applicable national and international regulations while setting the level of staffing and thinking about the requirements necessary in phases of bodily fitness, state of health, level of competence, and language skills to ensure the protection and health of seafarers in keeping their obligations onboard the ship.

- Respect of general obligations and responsibilities of the owner;
- Respect of general obligations and responsibilities of employees;
- Respect of the general obligations and responsibilities of the safety and health committee on board which include the following. (1) Ensure that the requirements of the competent authority and the ship owner in the safety and health sector are satisfied. (2) Address, through the captain, complaints and recommendations to the owner on behalf of the crew. (3) Examine matters of concern to the crew in matters of safety and health, and take the necessary measures on this basis to assess the safety and protection, including life-saving devices. (4) Study accident reports.
- Respect of general duties and responsibilities of the security officer. They include the following: (1) He should educate the crew members on safety issues. (2) Investigate safety lawsuits brought to its attention and seize the safety and fitness committee and individuals if vital.

#### 5. Conclusions

In this paper, the MICMAC method was used to assess and prioritize various manmade risk variables in PRM. An empirical study was conducted on the seaport terminals of Sfax (Tunisia). The results obtained concern the influences and the dependencies of all 26 identified risk variables which are exerted directly and indirectly, which will allow the various risk managers to design, propose, and initiate more effective policies in terms of prevention.

This work shows that risk management at is a strategic, capital, and inescapable process, as it affects all aspects of the professional activity, especially the port. From a regulatory point of view, port risk management is not only solicited but is becoming more and more required by both the supervisory authorities and the customers. In fact, it is part of a management system that now involves all the stakeholders in the port logistics chain.

The MICMAC method applied to the PRM system within the port of Sfax has allowed us to highlight the prioritization of its own risk variables. It positions the understanding of the port organization and its context, staff competence, internal audit, stabilization, and environment for implementing processes as the main input variables. Thus, the analysis of these statements through the MACTOR tool will shows the need for renewed sector governance with institutional organization, informational transparency, and an attractive structure to mitigate risks during port operations. Therefore, the MACTOR analysis is suggested for perspective works to study the power relations between the supply chain actors and to understand the convergences and divergences of objectives and to dissolve disagreements and conflicts between them for an effective SCRM.

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