Systematic Review on Cybersecurity Risks and Behaviours: Methodological Approaches

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Abstract: This paper presents a systematic literature review regarding risk perception and precautionary behaviour related to cybersecurity. Objectives encompassed identifying issues related to methodological approaches, the studies' operationalisation and other essential topics, highlighting significant gaps to be fulfilled in future investigations. The study included a search in the multidisciplinary databases of Science Direct, Web of Science, and the Scientific Repositories of Open Access in Portugal, focusing on publications after 2016. A total of nine articles were analysed. The review was developed using the Preferred Reporting Items for Systematic Review and Meta-analysis Protocols' research method. Also, publications were coded using the NVivo 12 software for synthesising the results. The small number of studies considered for analysis revealed that risk perception and precautionary behaviour concerning cybersecurity is still an under-explored study area. Furthermore, methodological gaps are highlighted for future works. Studies in the cybersecurity field provide a dataset for policymakers, directing efforts and predicting responses to digital technologies, making this subject matter highly substantial.

1 INTRODUCTION

Humanity has lived an era of extraordinary success concerning digital technological advancements, allowing the dissemination of information, and enabling communication worldwide (Castells, 2011; Pinto & Cardoso, 2021). Moreover, with the progressive evolution of digital solutions and the democratization of electronic devices, citizens use the Internet anytime and anywhere they wish (Baldi & Oliveira, 2018).

However, despite contributing to interpersonal interaction and information transmission effectiveness, the new paradigm in information systems and communication processes has brought security and privacy problems within the digital environments (Conteh & Schmick, 2021).

In this context, data are frequently forged and defrauded, making the digital environment a constant threat to information-sharing security (Loon, 2003). Examples of hazards that threaten the integrity of personal data on the Internet include phishing, doxing, identity thief, cyberbullying, viruses, surveillance and spyware (Conteh & Schmick, 2021). Further, while everyone is exposed to several kinds of danger, the use frequency of digital technologies seems to be directly related to the increase of risk of cyberattacks (Cheng, Lau, and Luk 2020).

According to Slovic (1981), the risk scenario regarding the technologies involves the citizens' awareness of the hazards they are exposed to. Thus, the security of personal information is associated to the user's behaviour on the Internet, being Risk Perception (RP) a predictor of the individuals' precaution when facing risks (Assailly, 2010).

Risk perception is not a recent study area and has been the subject of interest in different knowledge domains, aiming to understand citizens perceptions concerning the exposure to several hazards in society (Slovic, 2000). Nevertheless, although a diversity of hazards arises with the digital technologies, limited attention has been given to RP and Precautionary Behaviours (PB) in this area (Oliveira & Baldi, 2019).

In this paper, we update the prior work to deepen understanding of how Risk perception and Precautionary Behaviour regarding cybersecurity are

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currently being investigated (Oliveira & Baldi, 2019). Therefore, we expand our search to 2021 to achieve recent studies concerning these themes. In addition, we adopted the structural methodology "PRISMA" (Preferred Reporting Items for Systematic Reviews and Meta-Analyses) and used the NVivo 12 software for a systematic coding that gave rise to new discussion topics compared to those analysed in the previous study.

The article is organised as follows. In section two, we present the background theory and relevant studies. Subsequently, the methodology of this systematic review is presented. Section 4 present the results, and Section 5 the discussion. Finally, section 6 provides the most relevant conclusions.

2 BACKGROUND

There is no consensus in the literature regarding the meaning of the word risk. While according to some authors, the Latin etymology means that risk separates us from the known to confront us with the unknown and challenge it (Assailly, 2010; Bernstein, 1996), Mythen (2004) says that the derivations of the term "risk" come from the Arabic word "risq", related to the acquisition of health and fortune. Moreover, the risk is also related to "The actions we dare to take, which depend on how free we are to make choices." (Bernstein, 1996, p. 29), introducing the subjectivity of what is considered risky in different cultures.

Lash (2000) presents that dangers or risks, in the risk culture, should not be understood as being objective, but as inscribed in individualized ways of life, defending, therefore, that the perception of risk is an essential matter since it is subjective and is intrinsically related to the contexts of each citizens' lives. In this sense, Paul Slovic (2000) refers to Risk Perception as an intuitive daily risk judgment that the citizens rely on to evaluate typical and catastrophic hazards. As an interdisciplinary subject of concern, risk perception is not a recent area of knowledge (Starr, 1969) and has been widely studied across different fields, including psychology, social sciences, geography and anthropology (Slovic, 2000). Also, the past studies on risk perception have mainly been carried out in the United States and encompassed the proposal of a set of risk dimensions that help identify behavioural patterns in hypothetical situations related to the decision-making process when facing risks (Slovic, 1981). Some of these dimensions are the severity of consequences of the hazard, catastrophically effect of the danger, vulnerability face the danger, the novelty of the

hazard, and level of knowledge about the hazard. Further, Slovics' works were mainly directed to the latest devices and technologies of the time, such as Xray, nuclear power, cars and parachutes (Slovic, 1981; 1990). Regarding the dangers associated to digital technologies, some works are worth mentioning. For instance, the literature shows that the more voluntarily exposed people are to phishing, the lower they perceived the risk of getting involved in situations like these on the Internet. Also, the risk perceived is reduced when positive effects are immediate and negative consequences of an action are delayed (Kahneman, 2011).

Huang (2010) and Garg & Camp (2012) studied 21 and 15 dangers related to the cybersecurity domain, respectively. Higher perception of risk is directly related to the severity of consequences of a danger, duration of its impacts and previous accident history involvement in the cybersecurity domain (Huang, 2010). Equally, Garg & Camp (2012) verified that voluntariness to danger, knowledge of science concerning a hazard, controllability of the danger, the newness of the danger, dread, and severity of effects were significant predictors of risk perception. Moreover, while people frequently underestimate cybersecurity threats (LaRose, Rifon, & Enbody, 2008), perceived risk is lower when people think they control a particular cybersecurity situation (Rhee, Ryu, and Kim, 2012).

Ng et al. (2009) verified that an individuals' security behaviour is directly proportioned to their risk perception regarding the specific danger, the perception of the threat, and the effectiveness of their capacity to solve the problem. Additionally, the authors affirm that individuals should use specific necessary actions to avoid security problems, such as using strong passwords, frequently changing passwords, and conducting regular backups. Pattinson and Anderson (2005) presented risk perception as a mediator in the relationship between risk communication and risk-taking behaviour in information security. Concerning security actions, although college students are highly engaged in more precautionary behaviour (for instance, using antivirus software), Öğütçü et al. (2016) identified that the exposure to hazards was highest among this social fringe. Furthermore, Mariani & Zappala (2014) verified that self-competence was related to a positive precautionary behaviour against attacks from a computer virus, while Slovic, MacGregor & Kraus (1987) affirm that the risk dimensions that predict perceived risk are also possible predictors of precautionary behaviour. Therefore, risk perception and precautionary behaviour are associated.

In the following section, we will present the methodological path to operationalising the present systematic literature review.

3 METHODOLOGY

Systematic reviews have received credibility in the social sciences since they offer consolidated and unbiased information about a particular subject and is associated with a starting inquisition (Liberati et al., 2009; Gough et al., 2017). Thus, the primary outcomes of this systematic review must answer the following question: What empirical works are available in the literature on risk perception and precautionary behaviour regarding cybersecurity issues, and what are the main significant gaps to be fulfilled in future studies?

The present work was developed using the PRISMA method, a guided protocol for a systematic review to achieve reliable data. The PRISMA method ensures that the systematic review is carefully planned and explicitly documented, promoting consistent results by the review team, accountability, research integrity, and transparency of the completed review (Liberati et al., 2009).

In this sense, the first step was to define the data basis for searching the documents related to risk perception and precautionary behaviour within the cybersecurity domain. Considering that these subjects run through different knowledge areas, we opted for Web of Science and Science Direct data basis. Furthermore, the search was also made in the Scientific Repositories of Open Access in Portugal (RCAAP) to find works carried out under the Portuguese scope.

After choosing the data basis, the next step was to determine the appropriate keywords, covering risk perception, cybersecurity, and precautionary behaviour. This study was carried out in May 2021 and was limited to peer-reviewed journal and proceedings articles published from 2016 onwards since a relevant review was published in 2015 (Quigley et al., 2015). Works that exhibit studies related to RP or PB but not encompass the two subjects were also accepted. However, it is worth highlighting that all the works should approach cybersecurity issues. Also, the works must be published in English and present empirical studies.

The screening process comprised the exclusion of duplicate documents. Then, after the titles and abstracts were analysed, the articles that did not fit the inclusion criteria were removed. Next, the papers have been fully read for the selection of the appropriate studies for this review. After, the publications were read in full and coded using the NVivo 12 software. The parameters for analysis were: (1) methods for data collection, (2) country of the study, (3) sample, (4) methodological approaches, (5) inclusion of the topics in the query (i.e., RP, PB, and Cybersecurity), (6) articles' keywords, and (7) cybersecurity issues addressed.

4 **RESULTS**

The categories in NVivo were aggregated into groups that contain relevant topics for the analysis of results.

4.1 Overview of the Studies

As a result of the search in the previously mentioned databases, 30 articles were found in Science Direct, only one repeated article has been found in Web of Science, and none was found in the RCAAP. Furthermore, an extra article has been integrated into this study since it complies with the inclusion criteria. Thus, 31 research articles were considered possible to use in this systematic review, with only nine elected at the end of the screening process. Figure 1 shows the PRISMA flow diagram with the screening of the articles to integrate this study.

The main regions where the studies were carried out included the United Kingdom and the USA, with five and three studies conducted in these countries, respectively. Other countries were Netherlands, Turkey, Hong Kong, Germain, Sweden, Poland and Spain. Among the papers, only one was published in 2016, while two studies were published in 2017, two in 2018, two in 2019, and two in 2020. Table 1 presents the general information of the studies, with a list of the authors, year of publication, the goal of the study, and the main contributions of the articles.

4.2 Methods and Methodologies

Concerning the methodological approaches, the papers present quantitative approaches, comprising experimental and empirical studies. Eight studies conducted online surveys, while one used a telephone survey to collect data (Cheng et al., 2020). In addition, participants were chosen through different methods, with seven papers using online recruitment, one using the selection as a sample method (Öğüçü et al., 2016), and one using the random digit dialling method (Cheng et al., 2020). The digital recruitment method encompassed Toluna (Bavel et al., 2019), recruitments by e-mail (Schaik et al., 2017; Jeske et al., 2017; Schaik et al., 2020), recruitment services of

online panels (Jansen & Shaik, 2019; Shaik et al., 2018), and Mechanical Turk (Cain et al., 2018).



Figure 1: PRISMA Flow diagram with the screening process and number of documents selected in each phase.

Data were collected using a psychometric paradigm with internet users through different scales in all studies. In this direction, none of the research articles presented a distinct strategy for obtaining outcomes, all using a traditional rating scale as a metric measure in the empirical phase.

4.3 Sample

The sample was different in all articles, comprising a minimum of 201 in the work of Van Shaik et al. (2018) and a maximum of 2014 in the empirical study conducted by Bavel et al. (2019). The mean age in the Bavel et al. (2019) studies was 40.8 years, with 50.3% of females and 40.84% with upper secondary education. Jansen & Schaik (2019) carried out two studies (ages between 19-76 years), being one with 1,201 individuals (50.6% females and 52.4% with high education), and a second with a sample of 768 individuals, being 51.4% men and 52.5% with high education. In Cain et al. (2018), the age range of the sample was between 18-55+ years, with 142 women and 24.63% with higher education, against an average age of 42 years in a sample of 201 Facebook users, characterized by 92 women and 55% with less than fist degree in the studies of Schaik et al. (2018). In the work of Schaik et al. (2017), the mean age of the 436 participants was 23, with 336 females. Further, Jeske et al. (2017) conducted a study with 323 participants with a mean age equal to 22.78 in an age range from

18-60 (74.9% women), while the works of Öğütçü et al. (2016) included a sample with the mean age of 28.1 years old with 70.4% with high students' degree.

Table 1: General information of the studies.

Article	Goal	Main results
Schaik et	Check	Affect is positive for
al. (2020)	Facebook CS	perceived benefit and
	issues.	negative of perceived
		risk
Cheng et	Verify IT use	Cybercrime
al. (2020)	and risk to	victimization was
()	involve in CS	inversely associated
	issues.	with perceived
	1000000	control fairness and
		happiness
Bayel et	Explore the	Coping messages
al (2019)	effects of	were more effective
un (2019)	notifications on	than threat appeals in
	CS behaviour	promoting secure
	es contribui.	online behaviour
Iansen &	Examine the	Fear appeals have
Schaik	impact of fear	great potential to
(2019)	anneal messages	promote cybersecurity
(2017)	on security	behaviour
	behaviours	benaviour.
/	against phishing	
Coin at al	Explore the	Conder and ago are
(2018)	users' behaviour	determinants in users'
(2018)	regarding cyber	behaviour and
	hugiono	knowledge regarding
	nygiene.	wher hygiana
Sahailt at	Examined right	Democration of misle was
$\frac{301}{2018}$	Examined fisk	high ast for
al. (2018)	perception and	autorbullying and
	habaviour	information showing
	related to CS in	information sharing.
	Faceback	
C -1 - :1+	Facebook.	Dist Densention and
$\frac{1}{2017}$	Examined risk	hisk Perception was
al. (2017)	perception and	thisf keylogger and
	hehevieurin CS	avharhullvin a
Lagles Pr	Evamined the	Three elusters of
Soboil	familiarity of	Infee clusters of
(2017)	users about 16	labelled regarding
(2017)	anline threats	security behaviour
Örötrö et	Examined lave1-	Degulta above
$a_1 (2016)$	of awareness	significant differences
al. (2010)	toward	significant differences
	information	habita of intervet
	information	habits of internet
	security in terms	usage.
	of perception	
1	and behaviour.	1

Schaik et al. (2020) presents two studies, one with 63 and the other with 233 individuals. The first sample with a mean age of 51.19 and the second with the mean age of 52.13, both ranged from 22 to 79,

while in Cheng et al. (2020), the average was 42.18 years old, with the range among 10-65. Finally, while the major sample of analysis encompassed random people from the population, the sample in Shaik et al. (2017) and Jeske et al. (2017) were university students, and Öğütçü et al. (2016) comprised people associated with the university environment.

4.4 Topic Trends

With the word frequency NVivo functionality, the keywords determined by the authors in the studies were verified, highlighting the topic trends among articles. It shows that "Information" and "Security" are the most frequent words the articles use as a keyword directly relating to cybersecurity. The words "Risk" and "Perception" appear more often than "Precautionary", meaning that studies are more related to risks than to precautionary factors. Nevertheless, the "Behaviour" (or its analogue "Behavior") subject emerges, showing that studies regarding users' behaviour are a topic of concern.

It is worth highlighting that, although studies do not always use concrete keywords, topics were interpreted according to the nature of the variables studied. Thus, even if a study does not use the term Precautionary behaviour but uses Security behaviour, it was considered that such works included an analysis within the precautionary online behaviour topic of concern. Simultaneously, if a specific work measures the perception of digital hazards, the RP was identified as a matter of study.

Furthermore, based on the text search and word count on NVivo, it was possible to verify the most online security hazards addressed by the articles. We found that the words "cyber" and "attack" appear more frequently among articles, reflecting a broad topic with several threats. Among these threats are viruses, phishing, and identity thief, which had the second higher frequency in the articles, followed by trojan, keylogger, cookies and rogue ware, which is a less explored subject among the papers.

5 HINTS FOR FUTURE RESEARCH

Intending to provide a satisfactory answer to the research question, in this section, we provide a discussion concerning the methodological approaches and additional topics to present gaps to be fulfilled in future works.

Three papers selected in this review used the Protection Motivation Theory (PMT) to fundament their studies (Bavel et al., 2019; Jansen & Schaik, 2019; Schaik et al., 2020). The PMT attempts to explain the cognitive processes that mediate behaviour in the face of a threat, which may lead to two different processes, including focusing on the threat itself or the action against the threat (Rogers et al., 1975). In this sense, studies of Bavel et al. (2019) Jansen & Schaik (2019) conducted experiments with participants, using copying and threat appeal messages to identify security behaviour. Coping messages were more effective than threat appeals in promoting secure online behaviour in Bavel et al. (2019) 's study, while, in contrast, fear appeals have great potential to promote cybersecurity behaviour in the works of Jansen & Schaik (2019). Schaik et al. (2020) also found that "affection" is a positive determinant of perceived benefit, indicating that a risky online service could persuade someone to use their products with an enticement strategy, increasing the perceived benefit, leading to low perceived risk.

While these three works conducted experiments with participants, the others had no intention to intervene with individuals. This ups on new future work possibilities, as intervention studies could bring accurate information concerning precautionary behaviour and gather knowledge of improving peoples' awareness regarding digital technologies (Kirlappos & Sasse, 2012).

Methodological limitations are observed as all the works used psychometric measures to collect and analyse data. Consequently, there is a lack of qualitative data concerning risk perception and precautionary behaviour in cybersecurity. This is significant since precautionary behaviour and risk perception are directly related to cultural factors and social constructs (Mythen, 2004). In this sense, the lack of qualitative measures and approaches makes it difficult to gather subjective data regarding the specific behaviour (Mishna et al., 2018).

To know in-depth about the nature and characteristics of a given phenomenon and discover the reasons for observed patterns, qualitative analyses are necessary (Busetto, Wick, and Gumbinger, 2020). Regarding cybersecurity, Mishna et al. (2018) state that while quantitative analysis provides results that can be generalised, qualitative analyses add rich information that allows a deep understanding of cyber aggression. Mythen (2004) presents a critique regarding the frequent use of the psychometric paradigm in research on risk perception by social sciences, claiming that risk perception and security behaviour are culturally and subjectively constructed.

In this sense, RP and PB should also be analysed through a qualitative lens, through a focus group or interviews, which presents itself as a reliable manner to achieve a rich understanding of the participant's point of view (Mishna et al., 2018).

However, it is noteworthy that, to develop comparable works, a methodological and conceptual cohesion between academic research is necessary (Oliveira & Baldi, 2019). In addition, inconsistencies between definitions lead scholars to study different phenomena under the same title, so it is essential to reach a consensus on the definition and concept of the studied phenomena (Olweus & Limber, 2018). Therefore, an effort must be made to standardise the concepts so that comparison between studies is possible.

Since the entire world is changing its habits, moving the daily activities from the physical world to a digital one, substantial contributions can be achieved by conducting a cross-cultural study. For instance, Bavel et al. (2019) found that Polish and Spanish individuals are the more insecure among people from Sweden, Germany, and United Kingdom. Also, interesting outcomes encompassed the different security behaviours among people from different nationalities, indicating that the decisionmaking process changes across countries (Bavel et al., 2019). In addition, Jeske et al. (2017) found differences in the familiarity with cyber-threats between people from the UK and the US, with the last one presenting more informed about phishing and social engineering. Similarly, Schaik et al. (2017) showed that university students from the UK perceive risks differently from the US. Thus, cross-cultural studies can bring valuable information for creating public policy cohesion in European countries.

Age is another topic of attention. Samples with a wide range of ages are more likely to identify disparities in people's behaviours in different age groups, making it possible to compare opinions and behaviours between several fringes. For example, Ögütçü et al. (2016) found that college students seem to be the most at-risk group, probably due to higher intense and frequent use of the Internet, especially social media. Bavel et al. (2019) affirm that age had a significant impact on the probability of suffering a cyberattack: "the older the participant, the more securely he or she navigated through the mock purchasing process." (p. 35). Also, their outcomes suggest that older adults are more vulnerable than younger adults to phishing attacks but less vulnerable to other cyber threats. Furthermore, both younger and older adults are likely to modify their security behaviours when following a warning of some kind (Bavel et al., 2019), although older adults tend to generally behave more securely than younger users on the Internet (Cain et al., 2018). This finding was unexpected since younger people usually have higher know-how about cybersecurity (Ögütçü et al., 2016).

Considering the importance of comparable data across ages to implement more effective public and contextual policies in different environments (e.g., universities, e-learning, social media, online banking), the Governmental organisations, research institutions, and the industry would benefit from studies encompassing individuals' security behaviour on Internet across several ages. However, studies that focus on a restricted social fringe can introduce specific and more profound knowledge regarding the studied population, being also relevant.

Regarding the perception of risk, Schaik et al. (2017; 2018) found that the hazards/activities judged to be most risky on Facebook were cyberbullying and failing to receive login notifications about the user. Additionally, it was identified that cyberbullying had elevated scores on general risk perception measurement (Schaik et al., 2017). Hence, considering that cyberbullying had the higher score among other cyber threats, has been widely studied and has a high prevalence in many countries (European Parliament, 2016), future works should involve online aggressions, such as cyberharassment, hate speech, and cyber-stalking, to verify RP and PB regarding these threats.

The relevance of studying cybersecurity is related to the damage caused by cyberattacks at a national and international level (Cheng et al., 2020). Hallman et al. (2020) present that the organisations and citizens suffer each day more with cyberattacks, giving rise to significant financial losses in several countries. Cybersecurity is, therefore, becoming critical to ensure the safety of humans and societies (Omerovic et al., 2019). In this regard, studies in the cybersecurity domain could help gather knowledge concerning human behaviour on the Internet, which helps to understand adequate security training under a specific population or context. People trained in cyber-hygiene or cybersecurity have higher precautionary behaviours, indicating a good strategy to prevent cyberattacks (Cain et al., 2018; Mishna et al., 2018). In this sense, longitudinal works could be helpful to verify the effectiveness of specific training in the cybersecurity field (Jansen & Schaik, 2019). Finally, it is suggested more studies on RP and PB in cybersecurity domain, especially in the Portuguese context, which must be deposited in national databases to enrich nationalised scientific data.

6 CONCLUSIONS

This paper presents a systematic review of risk perception and precautionary behaviour facing cybersecurity threats. We expanded on prior work to understand how Risk perception and Precautionary Behaviour regarding cybersecurity are currently being studied. To provide reliable answers to the research question, it was realized with the PRISMA method and NVivo software. Although risk perception is a long-time study area, and a plethora of threats frequently emerge, a small number of works revealed that RP and PB regarding cybersecurity are still under-explored.

The articles' attention is on the security of personal information, being other cyber-threats, such as sexting, cyber-harassment and cyberbullying, not frequently addressed. In this sense, future works should encompass these topics in their surveys or other measurement data collection. Furthermore, studies with practical experiments are also encouraged since they could bring accurate information concerning precautionary behaviour, elaborating practical training to better use the Information and Communication Technologies. Finally, in the current scenario, social networks offer new opportunities for sociability (Pinto & Cardoso, 2021) and communication being, however, necessary to pay attention to cybersecurity issues to promote interaction in a safe digital environment. Therefore, studies in RP and PB contribute to achieving insights to produce more secure commercial products, such as better protective software and hardware. Further, studies in the RP and PB area provide relevant information for policymakers to build efficient preventive and coping strategies, helping to predict public responses to technologies (Slovic, 1981; Fischhoff et al., 1978), making the subject matter in this review highly important.

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