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Determining the causal relationships among balanced scorecard perspectives on school safety performance: case of Saudi Arabia**Authors:****Turki Alolah**

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Highlights:

- Saudi Arabian schools have high accident rates due to poor safety system management.
- Safety performance balanced scorecard (BSC) developed for Saudi schools.
- Causal relationship between safety BSC perspectives identified.
- Safety performance BSC enables the evaluation of system-wide indicators of safety.

Determining the causal relationships among balanced scorecard perspectives on school safety performance: case of Saudi Arabia

Abstract

In the public schools of many developing countries, numerous accidents and incidents occur because of poor safety regulations and management systems. To improve the educational environment in Saudi Arabia, the Ministry of Education seeks novel approaches to measure school safety performance in order to decrease incidents and accidents. The main objective of this research was to develop a systematic approach for measuring Saudi school safety performance using the balanced scorecard framework philosophy. The evolved third generation balanced scorecard framework is considered to be a suitable and robust framework that captures the system-wide leading and lagging indicators of business performance. The balanced scorecard architecture is ideal for adaptation to complex areas such as safety management where a holistic system evaluation is more effective than traditional compartmentalised approaches. In developing the safety performance balanced scorecard for Saudi schools, the conceptual framework was first developed and peer-reviewed by eighteen Saudi education experts. Next, 200 participants, including teachers, school executives, and Ministry of Education officers, were recruited to rate both the importance and the performance of 79 measurement items used in the framework. Exploratory factor analysis, followed by the confirmatory partial least squares method, was then conducted in order to operationalize the safety performance balanced scorecard, which encapsulates the following five salient perspectives: safety management and leadership; safety learning and training; safety policy, procedures and processes; workforce safety culture; and safety performance. Partial least squares based structural equation modelling was then conducted to reveal five significant relationships between perspectives, namely, safety management and leadership had a significant effect on safety learning and training and safety policy, procedures and processes, both safety learning and training and safety policy, procedures and processes had significant effects on workforce safety culture, and workforce safety culture had a significant effect on safety performance.

Key words: safety, schools, safety performance evaluation, Saudi Arabia, balanced scorecard, systems theory, partial least squares, exploratory factor analysis, structural equation model

1. Introduction

1.1 Safety in Saudi school environments

The Saudi Ministry of Education recognises that the health and safety of its teachers, school executives, students, parents, visitors and the broader school community are of paramount importance. In fact, the ministry is committed to providing safety conditions in each school and seeks to minimise school accidents by using successful and accurate safety regulations. A number of regulations have been introduced in recent years in a bold attempt to rapidly improve safety in Saudi schools. The ministry, for instance, implemented regulations that enforce heightened expectations of student safety to ultimately reduce the rates of accidents and incidents. These regulations include compulsory first-aid courses for teachers, laboratory safety guidelines and student supervision, to name a few (Bendak, 2006).

Despite the implementation of stricter regulations, safety has not improved to the degree expected due to a lack of enforcement practices and ongoing safety performance evaluations. The application of these regulations by people who do not have safety knowledge leads to disasters such as the 2002 fire in a girls' school that resulted in 15 deaths (Prokop, 2003). Moreover, in the past decade (2002-2012), there were 19 student and teacher fatalities and more than 150 student injuries, of which 12 were very serious (Saudi Ministry of Education, 2013).

Poor communication is the main reason behind the lack of ongoing enforcement of safety regulations and performance evaluation. In Saudi Arabia, male and female roles are viewed as complementary rather than equal (Esposjto, 1982; Keddie, 1979; Saleh, 1972). El Guindi (1981) noted that “*one basic feature of Arab socio-cultural organisation is the division of society into two separate and complementary worlds, the men's and the women's*”. In Saudi Arabia, this division is relatively rigid and strict; sexes do not mix (El Guindi, 1981). This underlying feature of Saudi culture means that communication between the male dominated Ministry of Education and the female school system is often limited and a step removed from the school operational environment. Other issues include a general lack of safety awareness from teachers and school executives and regional schools often not being included in centrally administered safety initiatives. Concerns about school safety are growing in the wider community; however, there are still limited studies addressing the issue of school safety, particularly studies targeted at Saudi Arabia. Although Western countries have

conducted numerous studies on school safety (Nansel et al., 2001; Pellegrini & Long, 2002; Pepler et al., 2006), the majority of this research focuses on developed Western countries, whose results are often not transferable to the Middle East region's entirely different cultural context.

Saudi Arabia's 33,000 existing schools (Saudi Ministry of Education, 2013), as well as future schools that will be built, must implement a more robust safety management system. Indeed, to gain a clearer understanding of school safety in the Saudi context, it is important that further studies be conducted in this specific context. The following additional aspects should also be considered and taken into account when developing such a system: management (Choudhry, Fang, & Mohamed, 2007; Mearns, Whitaker, & Flin, 2003); safety training (Cooper & Phillips, 2004; Ng, Cheng, & Skitmore, 2005); safety processes (Clarke, 2010; Teo & Ling, 2006); safety culture (Grabowski, Ayyalasomayajula, Merrick, Harrauld, & Roberts, 2007; Mayze & Bradley, 2008; Wadsworth & Smith, 2009); and finally, the most important aspect, safety performance (Grabowski et al., 2007). These aspects cover the key elements of the school safety system and must be concurrently addressed in order to achieve a desired overall level of safety performance.

1.2 Evaluating school safety systems holistically

Senge (2006) advocate that to achieve any shared goal of an organisation, the fifth discipline of 'systems thinking' is paramount to ensure that all stakeholders learn from each other. Rasmussen (1997) argues for a system-oriented approach to safety risk management and accident prevention that is based on abstraction rather than structural decomposition. His research helped move the narrowly focused safety control system agenda to one that was broader and covered the entire socio-technical system. This transition from creating safety management control systems to strategic safety management systems that considers a destination statement (i.e. safety goal) for the organisation is imperative to create long-term sustainable improvements in safety outcomes.

A number of systems thinking tools have been developed in recent years in order to conceptualise, operationalize, model, diagnose or evaluate natural, scientific, engineered, social or conceptual systems. Systems thinking theory has been applied to safety problems across a range of disciplines including road safety (Larsson et al. 2010), hazardous waste fire causation (Goh et al. 2010), aerospace safety (Leveson, 2007), to name a few. All of these

studies highlight that all aspects of the multi-faceted socio-technical system must be considered in order to interpret safety outcomes. Safety systems theory is often applied after a series of significant incident or accidents occur in order to determine the key determinants of accident causation within that system. Such accident causation mapping exercises can also be utilised to build holistic safety system evaluation frameworks that encapsulate all pieces of the safety puzzle and lead to sustainable reductions in incidents and accidents. Such safety systems can be underpinned by systems theory but also need to be operationally definable and user friendly for laypersons to interpret and implement on a day-to-day basis.

The Balanced Scorecard (BSC) developed by Kaplan and Norton (1992) is an internationally recognised and commonly utilised tool for evaluating performance across range of disciplines and areas (e.g. Mohamed, 2003; Stewart, 2008). The first generation BSC was control orientated with only a simplistic attempt to encapsulate all aspects of a system through including both lead and lag indicators of a particular performance outcome. This original BSC framework has four performance perspectives (i.e. internal business, financial, customer and, innovation and learning) and attempted to integrate all the interests of key stakeholders on a scorecard. The term '*balanced*' in the name reflects the balance provided between short- and long-term objectives, between quantitative and qualitative performance measures, and between different performance perspectives. The diverse interests and measures are categorized in the above-mentioned four performance perspectives of the scorecard.

However, over time the BSC has evolved into one that can map entire systems and also embed complex systems dynamic modelling techniques (e.g. Capelo and Dias, 2009). Lawrie and Cobbold (2004) argue that the third-generation balanced scorecard has transitioned from a strategic control tool to one that enables organisations to strategically map causal relationships between particular factors to some key goals related to a 'destination statement'. Kunc (2008) also demonstrates how the balanced scorecard provides a robust foundation for developing causal system models as they include all facets related to a particular desired outcome. In this study, the authors have attempted to conceptualise and empirically construct a safety scorecard for Saudi schools that includes the causal relationship between enabling and outcome perspectives of safety performance.

1.3 Developing a new safety performance evaluation framework for Saudi schools

The Saudi Ministry of Education has introduced safety rules to regulate aspects related to school safety and associated risk factors. The aim of these regulations is to ensure student safety and to decrease the rate of accidents and incidents. However, these systems have not generated the desired level of safety in schools because the regulations neither address the system-wide leading and lagging measures of safety performance nor provide methods for evaluating safety issues in Saudi schools. Applying the concept of a BSC could address this gap by effectively providing a measure of school safety. According to Kaplan and Norton (1996), the BSC provides employees (i.e. school personnel) with the necessary knowledge and skills acquired through learning and growth. The BSC approach also can innovate and build appropriate strategic capabilities and efficiencies. Some scorecard elements would also identify cause-and-effect relationships, that is, the impact of school safety processes and improvements on overall safety performance, goals, measurements, and perspectives. Strategic aspects would include the development of areas that define the scope of a BSC system, the strategic grid or logical framework for organising the various objectives, and the strategic framework, which is the combination of all the strategic grid's objectives. Incorporating such strategic aspects would provide one complete framework to manage the overall strategy and its constituent elements. The BSC system would also include the desired targets and templates, i.e., the visual tools to guide people in constructing and achieving the desired long-term objectives. The fact that performance is always an integral part of the BSC would help ensure that appropriate methods were identified to measure safety aspects, and importantly, to improve future performance. In addition, the causal relationships and interactions between the enablers and the goals of the developed safety performance BSC framework can be examined, thus providing a greater understanding of their inter-dependence and facilitating safety performance improvement in each school. As noted earlier, the aim of this research is to devise a safety BSC framework for measuring safety performance in Saudi schools and to develop a causal relationship among the developed safety measurement perspectives.

2. Research objectives

The overarching goal of this research investigation was to develop a robust safety performance BSC framework that could be later applied to benchmark, monitor and effectively manage safety in the growing Saudi public school system. Specific objectives completed to achieve that stated goal included:

- Develop a conceptual safety performance BSC that includes diverse perspectives that will encapsulate the system-wide leading and lagging indicators of safety performance in Saudi schools;
- Develop an operationalized safety performance BSC with statistically validated perspectives, factors and measurement items; and
- Determine the statistically significant causal relationships among safety performance BSC perspectives.

3. Conceptual safety performance BSC for Saudi schools

Numerous aspects of safety performance evaluation were considered and critiqued in the development of a safety performance BSC framework for Saudi schools. These aspects include school structure, processes, and staff hierarchy. An extensive review of the completed safety evaluation literature yielded five perspectives that encapsulate the system-wide leading and lagging indicators of safety performance. These perspectives are: safety management and leadership; safety learning and training; safety policy, procedures, and processes; workforce safety culture; and safety performance. Each perspective must be understood, and the factors and items related to each perspective should be sufficiently defined. The developed perspectives included a number of factors, and each factor included a number of measurement items. The key factors of each BSC perspective are discussed and described in the following sections and a summary of derived framework perspectives, factors and items is detailed in Table 1.

3.1. Safety management and leadership

According to Mearns et al. (2003), management relates to the actual practices, management roles, and functions associated with safe workplace practices. Furthermore, Choudhry et al. (2007) note that management plays a key role in promoting a positive safety culture. For example, when employees are aware of their responsibilities regarding incident and injury prevention, they will exhibit more interest in maintaining a safe and healthy work site. However, Håvold & Nasset (2009) indicate that management is concerned with the extent to which employees perceive that the organisation provides an effective information exchange regarding safety matters. Mearns et al. (2003) note that management also relates to the level of employees' trust in their supervisor, the competence of the supervisor to support safety

practices, and the willingness of the supervisor to accept responsibility for mistakes. Teo, Ling, & Chong (2005) indicate that management should introduce incentives to improve safety practices.

3.2 Safety learning and training

Management's attitude and actions are devoted to providing the necessary job-related training and promoting the importance of safety training to all school users (Cooper & Phillips, 2004). To implement training and education, the development of safety training programs and the allocation of resources should be additional concerns (Ng et al., 2005). The enhancement of safety awareness among school users should include promotional strategies such as mission statements, published materials, and media (Choudhry et al., 2007). To incorporate the lessons learned from accidents and near accidents, safety improvement strategies might include the use of incident/accident reports and feedback (Håvold & Nasset, 2009). Overall, this perspective is concerned with school users' perception, knowledge, and competency regarding safety practices (Håvold & Nasset, 2009).

3.3 Safety policy, procedures, and processes

To effectively evaluate safety performance and work practices and to improve the effectiveness of safety management systems, Teo & Ling (2006) suggest that management should comply with organisational safety policies, procedures and processes. These researchers also indicate that safety audits and reviews are a structured process of collecting independent information on the efficiency, effectiveness, and reliability of the total safety management system, and of drawing up plans for correction and preventative action. This perspective is also concerned with the level of information documented in an audit/accident investigation report, users' satisfaction with follow-up actions taken by management, and supervisors' interest and ability to take necessary action (Clarke, 2010; Grabowski et al., 2007; Huang, Chen, Krauss, & Rogers, 2004; Kines et al., 2010; Lawrie, Parker, & Hudson, 2006). Safety policies and procedures are considered to be one of the most influential elements driving safety performance, because organisational policies regarding safety have a significant influence in cultivating a positive and healthy safety culture (Clarke, 2010; Kines et al., 2010; Ng et al., 2005; Teo et al., 2005). Additionally, safety processes can take responsibility for safety equipment, tools, and other accessories (Glendon & Litherland, 2001; Kines et al., 2010; McDonald, Corrigan, Daly, & Cromie, 2000; Sawacha, Naoum, & Fong, 1999; Teo & Ling, 2006; Teo et al., 2005). Overall, this perspective is concerned with

regular maintenance and the reinforcement of positive achievement (Kines et al., 2010; Teo & Ling, 2006).

3.4 Workforce safety culture

Mearns et al. (2003) defined safety culture as “*that assembly of characteristics and attitudes in organisations and individuals, which establishes that, as an overriding priority, safety issues receive the attention warranted by their significance*”. The safety culture is particularly important in Saudi Arabia because it forms the context within which individual safety attitudes develop and persist and safety behaviours are promoted. Additionally, this perspective is concerned with the openness and the effectiveness of the organisation’s reporting system and users’ propensity to report accidents (Grabowski et al., 2007; Mayze & Bradley, 2008; Wadsworth & Smith, 2009). Additionally, this perspective focuses on users’ perception of the safety of the work environment, including feedback, responsibility, empowerment, and reporting (Clarke, 2010; Mayze & Bradley, 2008; Wadsworth & Smith, 2009). The work situation and the effect of pressure on individuals’ behaviours, attitudes, and safety practices are also examined (Glendon & Litherland, 2001; Håvold & Nasset, 2009). Finally, this perspective is concerned with the causes of accidents/incidents and managerial and individual efforts regarding safety preservation (Håvold & Nasset, 2009).

3.5 Safety performance

Grabowski et al., (2007) define safety performance as a measured element using organisation users’ perceptions of safety in their work environment. Several researchers have considered organisation users’ perceptions of workplace safety as a safety performance variable, along with other variables such as historical data on accidents and other incidents, the development of a safety system, individual behaviours and attitudes towards safety practices, the monitoring of safety compliance, the establishment of safety committees, the communication of safety policies, and organisation users’ participation (Glendon & Litherland, 2001; Mayze & Bradley, 2008). The safety performance perspective is concerned with individual safety behaviours, the willingness to participate, and the implementation of a checklist before performing safety practices (Clarke, 2010; Glendon & Litherland, 2001), as well as the frequency of accidents and incidents in the workplace (Grabowski et al., 2007). This perspective is viewed as the most important aspect in Saudi schools because this outlook is concerned with emergency plans, response times to an accident/incident, and emergency training (Cooper & Phillips, 2004; Teo & Ling, 2006), which are often lacking in the Saudi

educational environment. The safety performance perspective is concerned with safety feedback and reporting in the workplace and the assessment of corresponding corrective and preventive actions (Clarke, 2010; Cooper & Phillips, 2004; Glendon & Litherland, 2001; Mayze & Bradley, 2008; Teo et al., 2005).

Table 1: Synthesis of literature supporting safety performance BSC perspectives

Perspectives	Factors	Items	Authors
Safety Management & Leadership	Management commitment to safety	Management actions safety issues	Choudhry et al., (2007); Mearns et al., (2003); Rundmo & Hale, (2003); Wadsworth & Smith, (2009)
		Management promotes a safety culture	
		Management provides adequate resources to safety	
		Management participation in risk assessments, consultative committee meetings, and inspections	
	Safety communication	Management encourages employees to voice concerns and safety improvement proposals	Choudhry et al., (2007); Håvold & Nasset, (2009); Kines et al (2010)
		Management and supervisors have an open door policy	
		Safety information is brought to employees' attention by their supervisors	
		Safety information is provided (e.g. media, mission statements, accident statistics, etc.)	
	Employee involvement in safety	Safety information (i.e. procedures) is visibly present in the workplace	Choudhry et al., (2007); Mearns et al., (2003)
		All levels of employees are empowered to be involved in safety management	
	Perceived supervisor competence	Employees are involved in setting safety objectives, decision making, and improvement plans	Choudhry et al., (2007); Mearns et al., (2003); Wadsworth & Smith, (2009)
		Supervisor is more attentive to safety issues than the average employee	
		Supervisor is trusted and can relate safety-related information to employees	
Safety Learning & Training	Safety practice incentives	Supervisor has the adequate skills and authority to tackle safety issues	Teo et al., (2005)
		Monetary incentives (e.g. bonuses) for employees for good safety practices	
		Recognition incentives (e.g. safe employee of the month) for employees for good safety practices	
	Safety training and seminars	Punitive measures for continued poor safety practices (e.g. fines, demotions, etc.)	Choudhry et al., (2007); Cooper & Phillips, (2004); Håvold & Nasset, (2009); Ng et al., (2005)
		Development of safety training (e.g. short talks, group meetings, and workplace safety responsibilities)	
		Provision of safety training to all employees	
		Resource allocation for safety training	
	Safety promotional strategies	Adequate and up-to-date safety training	
		Enhance safety awareness through clear mission statements (e.g. slogans and logos)	Choudhry et al., (2007); Sawacha et al., (1999)
		Provision of published materials (e.g. books, statistics, and newsletters)	
		Provision of media promotion (i.e. posters, displays, audio-visual media, e-mail, and Internet)	
	Safety learning openness	Employees give tips to each other on how to work safely	Håvold & Nasset, (2009)
		Accident/incident reports are used to improve safety.	
		Employees learn lessons from near misses and incident reports	

Perspectives	Factors	Items	Authors
Safety Policy, Procedures and Processes	Safety knowledge and competence	Feedback is used to improve safety	Håvold & Nasset, (2009); Huang et al. 2013
		Employees are familiar with the company's safety policy	
		Employees understand the purpose of the Safety Management System	
		Employees know when to report near accidents	
	Safety audits and reviews	Conducting safety inspections and supervision	Håvold & Nasset, (2009); Lawrie et al., (2006); Ng et al., (2005); Teo & Ling, (2006)
		Employment of safety office and supervisor	
		Familiar with the company's safety policies and procedures	
		Audit program is conducted regularly	
	Safety accountability and feedback	Publication of safety issues to staff members and parents	Clarke, (2010); Grabowski et al., (2007); Huang et al., (2004); Kines et al., (2010); Lawrie et al., (2006); McDonald et al., (2000)
		The results of accident investigation are fed back to the supervisory level	
		Employees are satisfied with the feedback given on accidents/incidents	
		Employees are satisfied with follow-up measures taken after accidents/incidents	
	Safety policies and procedures	Development of emergency plans and procedures	Clarke, (2010); Glendon & Litherland, (2001); Kines et al., (2010); Ng et al., (2005); Teo & Ling, (2006)
		Implementation of safety audits to the safety management system	
		Supervisor monitors progress towards safety improvement goals based on the feedback and weekly meetings	
		Safety policies/procedures can be followed without conflicting with work practices	
	Safety operations and governance	Equipment, tools, and other accessories are maintained regularly	Glendon & Litherland, (2001); Kines et al., (2010); Ng et al., (2005); Sawacha et al., (1999); Teo & Ling, (2006)
		Conducting training on the use of safety equipment	
		Safety officer's attitude has great influence on others' safety attitudes	
	Built environment maintenance	Development of a safety checklist to actively maintain facilities before accidents occur	Kines et al., (2010); Teo & Ling, (2006)
		Identification of any safety area problems and respond in a timely manner	
Workforce Safety Culture	Propensity to report accidents and incidents	Employee perceptions of the effectiveness of the reporting system	Grabowski et al., (2007); Mayze & Bradley, (2008); Mearns & Håvold, (2003); Wadsworth & Smith, (2009)
		Employee willingness to report a co-worker's failure	
		Employee perceptions of the company's ability to correct mistakes	
	Individual responsibility to safety	The influence of personality on safety practices	Clarke, (2010); Grabowski et al., (2007); Mayze & Bradley, (2008); Wadsworth & Smith, (2009)
		Value placed on personal safety responsibility	
		High-quality work environment leads to better personal safety responsibility	
		Employee involvement in informing management of safety issues	
		Employee ability to consider safety as a top priority	
	Perceptions of	There are enough employees to carry out the required	Glendon &

Perspectives	Factors	Items	Authors
Safety Performance	work situation and pressure	work	Litherland , (2001); Håvold & Nessel, (2009); Nansel et al., (2001)
		Employees have enough time to carry out their tasks	
		Realistic times are scheduled for completing assigned tasks	
		Work procedures are presented clearly	
	Fatalism	Accidents are unavoidable	Håvold & Nessel, (2009)
		The use of machines and technical equipment makes accidents unavoidable	
		Accidents seem inevitable despite the school's efforts to avoid them	
	General safety behaviours of staff	The influence of safety attitudes and behaviours	Clarke, (2010); Glendon & Litherland , (2001); Mayze & Bradley, (2008)
		Behaviour checklist towards safety practice	
		The willingness to comply with procedures and policies, and to participate in safety practices	
		Usage of personal protection equipment	
	Accidents and Incident rates	Measurement of accidents and incident rates	Glendon & Litherland, (2001); Grabowski et al., (2007); Mayze & Bradley, (2008)
		Recordable accidents/incident frequency	
		Total injury frequency	
	Emergency response	Emergency response preparedness	Cooper & Phillips, (2004); Glendon & Litherland , (2001); Håvold & Nessel, (2009); Teo & Ling, (2006)
		Employees can identify the cause of an incident in a timely manner	
		Employees competency handling emergency situations	
	Safety reporting, response and corrective actions	There are clear and well-documented procedures for developing remedial actions based on the incidents' causes	Clarke, (2010); Cooper & Phillips, (2004); Glendon & Litherland , (2001); Mayze & Bradley, (2008)
		An effective documentation management system ensures the availability of procedures	
		Auditors' reports can provide valuable feedback and a basis for corrective and preventive actions	

4. Conceptualised causal relationships among safety performance BSC perspectives

4.1 The enablers of safety performance outcomes

The BSC framework developed by Kaplan and Norton (1992) provides the theoretical foundation that underpins the leading indicators of the safety performance BSC perspectives. Apart from the field of commerce in which the framework originated, the BSC has been adapted to the following range of performance evaluation areas: information technology (Stewart, 2008); healthcare (Inamdar, Kaplan, & Bower, 2002); and tourism (Phillips & Louvieris, 2005), to name a few. The BSC perspectives intentionally focus on both leading and lagging indicators to provide a broader indication of both current and likely future performance trends, in order to go beyond traditional safety performance evaluation

approaches that are too narrowly focused on lagging indicators (e.g. no. of accidents). This feature of the BSC framework was critical for this particular study as there needs to be a much greater understanding on the relationships among the developed safety BSC perspectives in order to unpack the mechanisms for improving safety performance in Saudi schools over the longer term. Thus, the following sections will present arguments for the hypothesised role of leading safety BSC perspectives and their associated factors in influencing the mediating and lagging perspectives of safety performance.

4.2 The role of safety management and leadership

Concerning safety learning and training, every school requires practical and knowledgeable staff. The calibre of the staff is the backbone of any school. Safety learning and training will occur when personnel are motivated, encouraged to be innovative and have been empowered by management (Yang, Wang, Chang, Guo, & Huang, 2009). According to Brown and Kenney (2006), management and leadership influence the quality of learning and training in any organisation. For example, management levels influence learning as a consequence of their effect on the collection and analysis of information. Additionally, leaders and managers provide training courses and seminars, ensuring that these learning opportunities are understandable and applicable. Managers' can ensure that safety training courses are appropriately selected and removed from the training schedule if they are not achieving targeted outcomes (Brown & Kenney, 2006). Moreover, management can accelerate information processing and decision-making, thereby diffusing safety knowledge more rapidly (Argyris & Schön, 1996). Beyond the effects of leadership in learning and training, management also is characterised by a unity of command, a win-lose competitive dynamic, a specialisation of tasks, and a focus on the rationality of ideas that excludes feelings, all elements that improve the learning and training culture (Argyris, 1999). This argument led to the following hypothesis:

H1: Safety management and leadership influences safety learning and training activities

Safety management and leadership also have a powerful oversight on the development of safety policy, procedures, and processes. Additionally, Argyris (1999) indicates that good management is commonly characterised by a skill set that can have a very positive influence on the safety policy, procedures, and processes of an education system. According to Hayman (2007), the influence of management and leadership on policy, procedures and processes to

improve safety systems and to raise school safety awareness also leads to staff taking on board higher levels of safety accountability. The above arguments led to the second hypothesis:

H2: Safety management and leadership influences safety policy, procedures, and processes

4.3 The role of safety learning and training

As shown in numerous studies, the concept of learning and training has attracted considerable attention from leading management and organisational behaviour thinkers such as Argyris (1999), Senge (2006), Marquardt (2000), Garratt (1999), and Pedler and Aspinall (2000). Although quantitative data is limited, anecdotal evidence indicates that learning-oriented leaders and managers promote a learning organisation culture that often leads to improved performance and over the medium to long-term sustainable competitive advantage (Brown & Kenney, 2006). In any organisation, there are varied perceptions regarding the ideal learning and training courses and seminars to gain sufficient learning traction on a particular topic. Learning is associated with the intensity and quality of training provided in a safe environment, followed by an appropriate practical experience on the basis of theory taught in the class. The learning process is not the same for everyone because the perception, exposure and mental states of the individuals affect the progression of learning. Furthermore, training involves both skills development and risk assessment associated with the task as well as an understanding of appropriate safety measures to prevent any calamity. During the process, employees are encouraged to be self-motivated to direct their actions towards accomplishing goals and keeping the constraints of risk and safety in consideration (International Atomic Energy Agency, 2012). Effective safety learning and training programs can enhance several aspects of the workforce safety culture, including heightened confidence to report safety issues, higher personal safety responsibility and a less fatalistic view of life, to name a few. This argument provides the foundations for the third hypothesis:

H3: Safety learning and training influences the workforce safety culture

4.4 The role of safety policy, procedures, and processes

The installation of appropriate safety policy, procedures and processes in an organisation can often be an effective means to address inadequate safety performance. Well-designed safety procedures are imperative since the safety risks must be concurrently assessed while

associated safety procedures are devised and the required safety measures are implemented. Designing safety action processes must also consider staff preparedness to deal with any kind of mishap (Dyson, 1994). For example, school safety policy must be able to deal with a broad range of violent behaviours, such as provocation, aggression, violence, and discrimination (Timmerman, 2003). According to Netshitahame & Van Vollenhoven (2006), to ensure that behaviour expectations and procedures are clearly communicated, consistently enforced and fairly applied, each school should draw up an explicit school safety policy and provide enforcement procedures that are in line with school policy. Kauffman (1997) and Scott (2001) indicate that the link between poor educational achievement and the types of behaviour that threaten school safety should be considered in school safety policy. A review article by Zohar (2010) illustrates a safety pyramid that shows safety policies and departmental priorities being key enablers to enhanced safety performance in organisations. These aforementioned aspects are of paramount significance because they directly portray the safety in Saudi schools. For example, the influence of policies, procedures, and processes on workforce safety culture has been noted through an increase in safety awareness, a focus on preventing incidents and accidents, and an increase in the safety culture for school users. Additionally, this influence also improves the safety culture of students, teachers, and school executives and increases their safety knowledge to prepare for and address emergency situations. This discussion provides the persuasion for the fourth hypothesis:

H4: Safety policy, procedures and processes influence the workforce safety culture

4.5 The role of workforce safety culture

Workforce safety culture refers to common behaviour patterns within the group of people constituting any organisation. People who demonstrate similar positive beliefs and behaviour patterns toward safety within the school generally reflect a strong workforce safety culture. A good safety culture is generally reflected by workers and managers placing a high degree of importance on safety for all work practices and there is greater propensity to report incidents and accidents. When a critical proportion of employees start to demonstrate good safety practices, a strong workforce safety culture tends to permeate across the entire organisation. The strength of the workforce safety culture is an important aspect in determining safety performance, as is the extent to which the pattern of behaviour aligns with school safety requirements. This situation requires a safety culture that promotes people who are willing to be proactive at trying new approaches for preventing school incidents and accidents.

Moreover, a strong culture tends to bind together the people of the school, contributing to smoother functioning and built-in rigidities.

Workforce safety culture is a perspective that can block, welcome, or reshape performance reforms in ways that are consistent with organisational norms (Jennings & Haist, 2004). This view has been supported by both qualitative and quantitative research. Yang and Hsieh (2007) determined that a strong workforce culture supports performance reforms. Julnes & Holzer (2002) and Moynihan & Landuyt (2009) indicate that a mission-oriented culture is positively associated with the success of performance reforms. For instance, a case study by Broadnax & Conway (2001) covering the topic of performance management in the Social Security Administration portrays a leader actively reshaping the organisational workforce culture using newsletters, e-mail, and other communication methods. These researchers found that a regular meeting with field officers and querying them with regard to performance indicators was considered to be the most important approach. In other words, “You don't change culture through memos” (Broadnax & Conway, 2001). Schneider (2004) suggests that the professional norms inherent in a workforce culture influence performance. Zohar and colleagues have completed a number of studies which link safety culture and/or climate factors with safety performance outcomes (e.g. Zohar 2010; Zohar et al. 2014).

Such findings indicate that fostering safety performance requires a supportive workforce safety culture. There are a number of theoretical reasons to believe that a developmental workforce safety culture is associated with safety performance. In a developmental culture, safety performance is integrated into management decisions as formative rather than summative feedback. This approach encourages school users to learn and improve their school safety performance. As a result, school users are more honest about safety weaknesses and more open to discussions on safety problems and alternative processes (Meyer, 1991; Meyer, Kay, & French, 1965; Moynihan, 2005), which will improve school safety performance. The above arguments led to the final hypothesis:

H5: The workforce safety culture influences safety performance

4.5 Summary of causal relations hypotheses

In summary, the following five hypotheses resulted from this study (Figure 1):

- H1: Safety management and leadership influences safety learning and training activities;
- H2: Safety management and leadership influences safety policy, procedures and processes;
- H3: Safety learning and training influences the workforce safety culture;
- H4: Safety policy, procedures, and processes influence the workforce safety culture;
- and
- H5: The workforce safety culture influences safety performance.

Figure 1: Safety performance BSC framework hypotheses

5. Research method

5.1 Research sample

The participants in this study included Saudi teachers, school executives, and Ministry of Education officers. A province-wide survey from the Ministry of Education was conducted among the participants. The sample selection for any empirical study is an important issue, and sufficient variability should be ensured in the sample selection so that statistical analyses will produce justified predictable values. The reliability of the results and theory formation depends heavily on sample selection criteria. Moreover, sample selection should be based on a theoretical paradigm rather than on statistical specifications (Yin, 2003).

In this study, the respondents are Saudi teachers, school executives, and Ministry of Education officers who participated in the survey. The study was conducted in five cities in Saudi Arabia that represent the five main Saudi Arabian regions. For each region, the largest and most populous cities were chosen for the survey as follows: Riyadh, the capital and the largest city in Saudi Arabia; Jeddah, the second largest city in Saudi Arabia and the capital city of the western region; Dammam, the most populous city in the eastern region; Hail, the most populous city in the northern region; and Abha, one of the most populous cities in the southern region.

5.2 Questionnaire development and survey

Creswell (2003) noted that careful questionnaire design is an important requirement for an effective and justified quantitative study. The survey questions are categorised to ensure that responses are based on past experiences, accurately reflect the participants' perceptions, and increase measurement reliability. Therefore, several aspects were considered when developing the questionnaire. First, the questionnaire was separated into the following two main sections: (1) gathered demographic information about the respondents and their experiences in the Saudi education environment, (2) elicited respondent opinions on the importance of each perspective in the proposed research framework. The respondents' opinions were based on their safety performance experience. Second, five-point scales were used to measure the operationally defined elements of the perspectives within the proposed research framework. Items for each perspective were generated and tested. Five-point Likert scales were applied to measure the developed safety performance BSC items in the Saudi schools using two columns. Column A was concerned with the importance of each item, whereas Column B dealt with the performance of each item, according to the experience of participants. The perspective consists of a set of statements that express the importance and the performance of each item as either favourable or unfavourable attitudes toward the object of the interest.

5.3 Statistical techniques

First, descriptive statistical analyses such as frequencies, percentages, and means were conducted regarding the sample profile (Sekaran, 2003). In addition to a visual inspection of frequencies for all perspective items, the data analysis included the measurement of central tendency and dispersion. Following this procedure, exploratory factor analysis (EFA) was conducted to examine the factor structures of the safety BSC perspectives, to reduce

redundant items (Neuman, 2006), and to improve the reliability of each perspective. According to Hair, Anderson, Tatham, & Black (2010), the exploratory analysis procedure is a powerful tool that can address a wide range of theoretical questions. This procedure also defines potential relationships in general form, which then allows the multivariate techniques to estimate relationships (Hair et al., 2010). In other words, by allowing the method and the data to define the nature of the relationships, exploratory analyses can then specify the relationships (Hair et al., 2010).

To test the developed hypotheses, appropriate multivariate statistical techniques were performed, including EFA, PLS confirmatory analysis, and PLS based structural equation modelling (SEM). This study employed an EFA to identify the underlying structure of data for each perspective. Based on the nature of the proposed relationships, the small sample size, and the research objective, the PLS analysis technique was considered an appropriate tool to evaluate the revised theoretical framework. PLS, which was developed by Wold (1980), is a second-generation multivariate analysis technique (Barclay, Higgins, & Thompson, 1995) used to analyse statistical frameworks that involve a set of perspectives and multiple items (Chin, 1998b; Fornell & Bookstein, 1982). In addition, the SEM analysis technique has been applied. According to Chin, (1998b) and Hulland, (1999), using SEM enables an assessment of the psychometric properties of the measures and facilitates simultaneous tests of the measurement and structural framework (Barclay et al., 1995). SEM is compatible with interval-style data and can assess a framework with a relatively small sample size (Barclay et al., 1995; Chin, 1998a, 1998b; Gefen, Straub, & Boudreau, 2000). SEM is also an appropriate technique when the major concern is predicting the dependent variables (Chin, 1998a, 1998b; Fornell & Bookstein, 1982). In summary, EFA, PLS, and SEM were chosen as statistical techniques in this study. The assessment criteria of each technique is presented and detailed in Table 2.

Table 2: Assessment criteria used in EFA, PLS and PLS-based SEM

Validity Type	Criterion	Description	Authors
Exploratory factor analysis (EFA)	Bartlett's Test	Bartlett's (1954) test of sphericity can be used to determine the factorability of data ($p < 0.001$).	Field, (2009); Hair et al., (2010); Tabachnick & Fidell, (2007)
	KMO	Kaiser-Mayer-Olkin measure of sample adequacy (KMO) can be used to determine the factorability of data, presenting the minimum	Hair et al., (2010); Tabachnick & Fidell, (2007)

	acceptable sample (0.60).		
	Anti-image correlation matrix	Can be used to test the factorability of data. Each matrix should be inspected for correlations above (0.30).	Hair et al., (2010); Pellegrini & Long, (2002); Tabachnick & Fidell, (2007)
	Cut-off factor loading	Each loading should be above (0.50).	Hair et al., (2010)
	Cronbach's Alpha	The scales for the reliability coefficients (0.70).	Pellegrini & Long, (2002)
	Cumulative variance	The total variance extracted by successive items of its perspective (60%).	Hair et al., (2010)
Partial Least Squares (PLS)	Item loadings	Measures how much of the items are explained by the corresponding factor. Values should be significant at (0.50).	Chin, (1998b)
	Cross-loadings	Cross-loadings are obtained by correlating the component scores of each item with all other factors. If the loading of each item is higher for its designated factor than for any of the other factors, it can be inferred that the frameworks of BSC perspectives differ sufficiently from one another.	Chin, (1998b)
	Fornell-Larcker criterion	The average explained variance (AVE) of the correlate of each factor must be higher than the correlation between the other factors.	Pepler et al., (2006)
	Cronbach's alpha (CA)	Alpha values ranges from 0 (completely unreliable) to 1 (perfectly reliable). Proposed threshold value for confirmative (explorative) research: CA > (0.80) .	Cronbach, (1951); Nunnally & Bernstein, (1994)
	Composite reliability (CR)	CR values between 0 (completely unreliable) and 1 (perfectly reliable). As an alternative to Cronbach's Alpha, it allows items to not be equally weighted. Proposed threshold value for confirmative (explorative) research: CA > (0.80) .	Ando, Asakura, & Simons-Morton, (2005); Nunnally & Bernstein, (1994)
	Average variance extracted (AVE)	Attempts to measure the amount of variance that BSC perspective captures from its items relative to the amount due to measurement error. Proposed threshold value: AVE > (0.50) .	Pepler et al., (2006)
Structural Equation Modelling (SEM)	Coefficient of Determination (R2)	Attempts to measure the explained variance of a perspective relative to its total variance. Values of approximately 0.670 are considered <i>substantial</i> , values around 0.333 <i>moderate</i> , and values around 0.190 <i>weak</i> .	Chin (1998b); Ringle, (2004)
	Path Coefficients	Path coefficients between the perspectives should be analysed in terms of their <i>algebraic sign</i> , <i>magnitude</i> , and <i>significance</i> .	Huber, Herrmann, Meyer, Vogel, & Vollhardt, (2007)
	Effect Size (f^2)	Measures if perspective has a substantial impact on its factors. Values of 0.02 , 0.15 , 0.35 indicate the predictor factor's <i>low</i> , <i>medium</i> , or <i>large</i> effect in the structural framework.	Chin (1998b); Cohen, (1988); Ringle, (2004)
	Predictive Relevance (Q^2)	The Q^2 statistic is a measure of the predictive relevance of a block of manifest perspectives. A tested model has more predictive relevance the higher Q^2 is, and modifications to a model may be evaluated by comparing the Q^2 values. The proposed threshold value is $Q^2 > 0$. The predictive relevance's relative impact can be assessed by means of the measure Q^2 .	Fornell & Cha, (1994); Geisser, (1975); Stone, (1974)
	Goodness-of-	Defined as the geometric mean of the average	Fornell & Larcker,

Fit (GoF)	communality and average R^2 (for endogenous perspectives) GoF ($0 < \text{GoF} < 1$), GoF = 0.1 is small , GoF = 0.25 is medium , and GoF = 0.36 is large .	(1981); Tenenhaus, Vinzi, Chatelin, & Lauro, (2005); Wetzels, Odekerken-Schröder, & Van Oppen, (2009)
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6. Data analysis and results

6.1 Descriptive statistics

Two-hundred participants from the Saudi educational environment, including teachers (55%), school executives (21%), and Ministry of Education officers (24%), participated in this study to express their perceptions of the proposed items regarding the balanced scorecard. Of the total, 70% were male and 30% were female. Approximately 85% of the participants had been working in an educational environment for at least 3 years, 78% had six to over 20 years of experience, and 22% had less than five years of experience. The majority of participants had from six to over 20 years of experience, whereas the remainder had less than six years including 38 with less than one year of experience. Regarding the participants' regional locations, 69% were in the central Saudi region, 11% in the east, 7% in the west and south, and 6% in the north.

The descriptive statistics provided preliminary findings that evaluated and interpreted the means values of all items in columns A and B. In addition, the data were free from extreme outliers and upheld the assumptions of normality and linearity. To check whether the sample used in this study sufficiently represented the participants, the assessment of the standard deviation and the standard error of the mean value indicated that a mean value could be used as a representative score for each item. Although participants were different (i.e., teachers, school executives, and Ministry of Education officers), the analysis of variance (ANOVA) results confirmed that the data set could be treated as a single sample. Therefore, the data set in the study satisfied the condition required for the three analysis techniques (EFA, PLS, and SEM). EFA was performed using the column A data (the importance of each item) to explore and confirm the structure of the factors for each individual perspective. PLS and SEM were performed on the column B data (the performance of each item) to confirm the EFA results regarding the relationship between perspectives and to test the proposed hypotheses. Correlation coefficients of each perspective and the overall framework were carried out to

determine whether all the perspectives represent the whole BSC framework. The results reveal that the correlation coefficients of each perspective (with items in each perspective aggregated) with those of all perspectives combined as a single framework were statistically significant at a level of 0.01 (Table 3). These results indicate a high degree of internal consistency among the perspectives and confirm the internal correlation among all perspectives in the framework, thus confirming the internal validity of the perspectives used in this study. Additionally, the reliability was significant through Cronbach's alpha (0.967) (Pellegrini & Long, 2002).

Table 3: Correlation coefficients of each perspective and the overall framework

Perspective	Number of Items	Column A		Column B	
		Pearson correlation coefficients of each perspective with perspective-total for the framework	Cronbach's Alpha (α)	Pearson correlation coefficients of each perspective with perspective-total for the framework	Cronbach's Alpha (α)
Safety Management and Leadership	17	0.636**	0.863	0.627**	0.859
Safety Learning and Training	16	0.753**	0.885	0.651**	0.866
Safety Policy, Procedures and Processes	19	0.760**	0.929	0.536**	0.913
Workforce Safety Culture	16	0.755**	0.898	0.722**	0.894
Safety Performance	11	0.579**	0.894	0.553**	0.821

**Correlation is significant at the 0.01 level (2-tailed).
Total Cronbach's Alpha: 0.967

6.2 Scale reliability analysis

As discussed earlier, column A data (the importance of each item) was using to measure the five proposed perspectives in the conceptual framework (SML, SLT, SPPP, WSC, and SP), five independent scales were used in the survey questionnaire. The scale reliability analysis was performed to assess the internal consistency of these perspectives. Table 3 presents the Cronbach's alphas for the measurement scales of the perspectives in column A. The values of the alpha coefficient of the five scales range from 0.863 to 0.929, which is much higher than the low value limit of 0.7, indicating very strong consistency among the scales. The high alpha value assumes that the scores of all items with one perspective have the same range and meaning (Cronbach, 1951).

These results support the use of exploratory factor analysis to determine whether any items should be removed and to accurately capture the meaning of the framework perspectives (Gerbing & Anderson, 1988; Hair et al., 2010; Koufteros, 1999). Because the main objective of this technique is to group the items into a set of latent dimensions rather than to condense individual respondents into distinct groups (factors), an *R factor analysis* was employed. This type of factor analysis is used to examine the relationships among variables to identify groups of variables that form latent dimensions or factors (Hair et al., 2010). Each perspective was processed to determine whether the items in each perspective could be represented by their factors. Additionally, to ensure that the items in each factor had practical significance, cut-off loading of 0.50 was used (Hair et al., 2010).

6.3 Confirming model architecture: exploratory factor analysis

Based on the previous results, EFA was performed separately for each perspective using a principle axis extraction method with Varimax rotation. The results of the EFA for each perspective are presented in Table 5. For the SML perspective, five factors were identified and explained 70.889% of the total variance. For the SLT perspective, the three identified factors explained 64.995% of the total variance. The SPPP perspective's three factors explained 69.416% of the total variance, whereas the WSC perspective's three factors explained 66.037% of the total variance. For the SP perspective, the three factors explained 78.906% of the total variance. Thirteen items were removed because the factor loading for these items was <0.50 . These items included the following: (A3.1), (B2.3), (B4.1), (C1.4), (C2.1), (C3.3), (C3.4), (D1.4), (D2.3), (D4.3), (E1.3), (E2.3), and (E4.1). The other items had factor loadings that were greater than 0.50.

The Cronbach's alpha for each perspective was greater than 0.70, indicating a good reliability of scale. To confirm the significance of the factor loading results, an evaluation of the correlation matrix was conducted using the Kaiser-Meyer-Olkin (KMO) and Bartlett's test. For each perspective, the results show that the KMO was greater than 0.70, which is acceptable, and the Bartlett's test was $p < 0.001$, a significant probability level. Finally, when assessing the factorability of the data, all remaining items fell within the acceptable range for a factor analysis of >0.3 ; although there were high correlations between items and other factors, the data still must have more than 0.50 factors loading.

Table 5: EFA results for all perspectives

Perspective	Cumulative variance	Cronbach's Alpha	KMO	Bartlett's Test	Total correlations between Items	Items deleted
SML (5F, 16I)	70.889%	0.854	0.736	$p<0.001$	0.319 to 0.686	A3.1
SLT (3F, 14I)	64.995%	0.872	0.812	$p<0.001$	0.301 to 0.785	B2.3 and B4.1
SPPP (3F, 15I)	69.416%	0.917	0.870	$p<0.001$	0.384 to 0.804	C1.4, C2.1, C3.3, and C3.4
WSC (3F, 13I)	66.037%	0.886	0.823	$p<0.001$	0.324 to 0.706	D1.4, D2.3, and D4.3
SP (3F, 8I)	78.906%	0.854	0.835	$p<0.001$	0.445 to 0.817	E1.3, E2.3, and E4.1

6.4 Validating model architecture: Partial least squares method

As previously described, column B was concerned with the performance of each item, according to the experience of the participants. Moreover, the Cronbach's alphas for the measurement scales of the perspectives in column B, after deleting previous items, are shown in Table 6. The values of the alpha coefficient for all five scales ranged from 0.807 to 0.889, and were much higher than the low value limit of 0.7, which indicated a very good consistency of the scales.

Table 6: Cronbach's alphas for the perspective performance measurement scales

Perspective	Number of items (refined)	Cronbach's Alpha (α) Column B
Safety Management and Leadership (SML)	16	0.845
Safety Learning and Training (SLT)	14	0.854
Safety Policy, Procedures, and Processes (SPPP)	15	0.889
Workforce Safety Culture (WSC)	13	0.844
Safety Performance (SP)	8	0.807

In conclusion, the developed scales comprised reliable and valid items that adequately captured the meaning of the framework perspectives and their related factors. These scales were used in the further analyses (i.e. PLS and SEM) by confirming the finding of the

framework perspectives (this section), and by identifying the relationships between the framework perspectives and the framework validation hypotheses testing (section 6.5). Based on an assessment of Table 2, the PLS algorithm can be run to calculate the framework parameters' estimates. Wold has developed PLS as a general method for the estimation of path frameworks involving latent perspectives indirectly measured by multiple items (Wold, 1966, 1979, 1980, 2006). The assessment of the measurement frameworks is considered a systematic application of the reflective criteria. In this study, cross-loading was higher than 0.05 (Chin, 1998b) except for two items that were less than 0.50 and therefore omitted (Table 7).

The second measure is the Fornell-Larcker criterion (Fornell & Larcker, 1981), which requires that the average explained variance (AVE) of the correlate of each factor must be higher than the correlation between the other factors (Table 8). The next measure is Cronbach's alpha (CA), the traditional criterion for assessing reliability, wherein a high alpha value assumes that the scores of all items with one perspective have the same range and meaning (Cronbach, 1951). The composite reliability (CR) is an alternative measure to Cronbach's alpha (Werts, Linn, & Jöreskog, 1974). Because CR overcomes some of CA's deficiencies, Chin (1998b) recommends CR as a measure. In this study, CR values for all perspectives above 0.80 indicate an acceptable range (Nunnally & Bernstein, 1994). The last measure is convergent validity, which involves the degree to which individual items reflecting a perspective converge in comparison to items measuring different perspectives. The AVE proposed by Fornell & Larcker (1981) is considered a commonly applied criterion of convergent validity. Urbach & Ahlemann (2010) suggest that to demonstrate sufficient convergent validity, an AVE value of at least 0.50 indicates that the perspective is on average able to explain more than half of the variance of its items. The AVE value for all perspectives in this study are greater than 0.50 (Table 9).

Table 7: Cross-loading framework at the item level

Item	SML1	SML2	SML3	SML4	SML5	SLT1	SLT2	SLT3	SPPP1	SPPP2	SPPP3	WSC1	WSC2	WSC3	SP1	SP2	SP3
SML11	0.74	0.64	0.20	0.25	0.13	0.54	0.34	0.22	0.07	0.13	-0.03	0.16	0.16	0.09	0.12	0.13	0.30
SML12	0.79	0.73	0.21	0.20	0.20	0.37	0.12	0.14	0.08	0.16	0.06	0.10	0.11	0.10	0.17	0.07	0.16
SML13	0.71	0.62	0.19	0.25	0.22	0.41	0.15	0.17	0.00	0.15	0.01	0.11	0.09	0.09	0.12	0.09	0.19
SML14	0.74	0.53	0.59	0.30	0.31	0.45	0.39	0.25	0.17	0.39	0.06	0.25	0.35	0.30	0.10	0.09	0.01
SML15	0.49	0.29	0.37	0.37	0.22	0.32	0.39	0.15	0.24	0.36	0.16	0.33	0.42	0.24	0.10	0.21	0.17
SML21	0.65	0.78	0.14	0.15	0.00	0.48	0.29	0.18	0.20	0.05	-0.04	0.12	0.02	0.13	0.04	0.10	0.22
SML22	0.59	0.78	0.23	0.11	0.06	0.37	0.25	0.06	-0.01	0.12	-0.11	0.17	0.10	0.00	0.06	0.09	0.19
SML23	0.64	0.77	0.31	0.19	0.28	0.49	0.25	0.16	0.08	0.15	0.08	0.16	0.13	0.15	0.14	0.21	0.25
SNL31	0.38	0.28	0.72	0.32	0.19	0.07	0.04	0.03	0.19	0.25	0.01	0.16	0.20	0.27	0.02	0.04	0.01
SML32	0.51	0.36	0.78	0.35	0.18	0.38	0.28	0.12	0.14	0.12	0.01	0.11	0.20	0.28	0.08	-0.01	-0.05
SML33	-0.05	-0.06	0.51	0.32	0.33	0.11	0.12	0.10	0.44	0.26	0.27	0.20	0.30	0.32	0.25	0.27	0.09
SML34	0.23	0.11	0.72	0.37	0.64	0.30	0.25	0.24	0.28	0.40	0.29	0.23	0.41	0.28	0.13	0.16	0.10
SML41	0.35	0.16	0.39	0.86	0.47	0.41	0.30	0.08	0.21	0.38	0.29	0.19	0.43	0.20	0.13	0.24	0.08
SML42	0.30	0.17	0.42	0.82	0.29	0.45	0.32	0.22	0.34	0.30	0.21	0.19	0.35	0.26	0.22	0.24	0.17
SML51	0.11	-0.07	0.42	0.42	0.84	0.27	0.23	0.13	0.21	0.39	0.33	0.05	0.39	0.22	0.16	0.18	0.06
SML52	0.39	0.29	0.41	0.41	0.93	0.41	0.30	0.13	0.15	0.39	0.20	0.14	0.36	0.23	0.22	0.29	0.20
SLT11	0.52	0.49	0.34	0.40	0.29	0.85	0.59	0.26	0.29	0.25	0.12	0.32	0.33	0.32	0.16	0.32	0.27
SLT12	0.56	0.56	0.36	0.44	0.28	0.81	0.53	0.23	0.29	0.20	0.18	0.33	0.29	0.32	0.14	0.33	0.27
SLT13	0.52	0.51	0.19	0.34	0.30	0.80	0.52	0.21	0.16	0.28	0.18	0.29	0.33	0.18	0.10	0.31	0.26
SLT14	0.52	0.53	0.17	0.43	0.44	0.80	0.40	0.18	0.11	0.20	0.13	0.25	0.28	0.16	0.07	0.23	0.28
SLT15	0.34	0.29	0.26	0.40	0.30	0.70	0.55	0.27	0.26	0.32	0.18	0.41	0.50	0.40	0.25	0.36	0.26
SLT16	0.37	0.33	0.23	0.40	0.29	0.74	0.49	0.16	0.15	0.24	0.14	0.31	0.41	0.22	0.18	0.25	0.33
SLT21	0.24	0.19	0.20	0.27	0.20	0.52	0.76	0.19	0.14	0.26	0.00	0.30	0.34	0.13	0.22	0.31	0.11
SLT22	0.20	0.22	0.22	0.22	0.16	0.43	0.64	0.27	0.19	0.31	0.10	0.22	0.27	0.15	0.05	0.18	0.06
SLT23	0.43	0.39	0.21	0.25	0.28	0.54	0.80	0.25	0.01	0.24	0.02	0.31	0.30	0.18	0.17	0.22	0.17
SLT24	0.27	0.17	0.12	0.32	0.22	0.37	0.66	0.66	-0.02	0.17	-0.05	0.27	0.31	0.17	0.31	0.21	0.16
SLT31	0.25	0.18	0.13	0.14	0.17	0.27	0.44	0.97	0.03	0.25	-0.01	0.20	0.30	0.08	0.24	0.17	0.28
SLT32	0.27	0.16	0.21	0.20	0.11	0.28	0.47	0.97	0.18	0.31	0.02	0.23	0.33	0.15	0.19	0.14	0.15
SPPP11	0.17	0.12	0.25	0.24	0.12	0.15	0.10	0.14	0.90	0.54	0.50	0.41	0.37	0.55	0.23	0.45	0.16
SPPP12	0.13	0.08	0.24	0.16	0.00	0.10	0.17	0.20	0.75	0.50	0.43	0.40	0.27	0.52	0.13	0.32	0.01
SPPP13	0.12	0.10	0.30	0.29	0.13	0.24	0.02	0.06	0.74	0.31	0.40	0.37	0.36	0.55	0.36	0.53	0.37
SPPP14	0.02	0.01	0.20	0.16	0.09	0.13	-0.01	0.10	0.74	0.33	0.43	0.28	0.19	0.44	0.12	0.26	0.10

Item	SML1	SML2	SML3	SML4	SML5	SLT1	SLT2	SLT3	SPPP1	SPPP2	SPPP3	WSC1	WSC2	WSC3	SP1	SP2	SP3
SPPP15	0.29	0.20	0.40	0.24	0.25	0.27	0.10	0.00	0.54	0.46	0.24	0.26	0.31	0.36	0.08	0.23	0.06
SPPP16	0.11	0.09	0.23	0.21	0.19	0.25	0.16	-0.02	0.81	0.33	0.43	0.38	0.29	0.52	0.18	0.41	0.19
SPPP17	0.00	-0.02	0.14	0.35	0.25	0.23	-0.04	-0.05	0.71	0.29	0.47	0.33	0.31	0.45	0.19	0.42	0.23
SPPP18	0.10	0.09	0.22	0.30	0.15	0.30	0.12	0.20	0.72	0.31	0.50	0.37	0.33	0.40	0.14	0.36	0.19
SPPP21	0.20	0.10	0.22	0.17	0.26	0.19	0.11	0.03	0.46	0.69	0.30	0.15	0.32	0.29	0.11	0.26	0.02
SPPP22	0.25	0.10	0.16	0.28	0.33	0.21	0.26	0.22	0.24	0.74	0.26	0.24	0.38	0.18	0.27	0.38	0.21
SPPP23	0.38	0.18	0.38	0.43	0.42	0.28	0.31	0.32	0.44	0.84	0.33	0.30	0.49	0.31	0.19	0.36	0.12
SPPP24	0.29	0.13	0.32	0.39	0.38	0.27	0.32	0.32	0.37	0.83	0.45	0.31	0.58	0.27	0.28	0.37	0.18
SPPP25	0.14	-0.01	0.21	0.22	0.23	0.22	0.27	0.17	0.41	0.64	0.33	0.21	0.36	0.42	0.14	0.25	0.05
SPPP31	-0.01	-0.03	0.17	0.17	0.12	0.12	0.03	-0.05	0.60	0.33	0.89	0.33	0.28	0.43	0.01	0.25	0.06
SPPP32	0.18	0.01	0.07	0.35	0.39	0.21	-0.01	0.10	0.19	0.39	0.59	0.20	0.39	0.28	0.19	0.29	0.26
WSC11	0.23	0.10	0.27	0.25	0.15	0.32	0.25	0.19	0.46	0.31	0.39	0.82	0.59	0.42	0.25	0.52	0.33
WSC12	0.25	0.20	0.25	0.21	0.15	0.34	0.34	0.16	0.40	0.27	0.30	0.86	0.49	0.41	0.30	0.57	0.37
WSC13	0.26	0.22	0.19	0.15	0.16	0.42	0.47	0.32	0.17	0.31	0.10	0.54	0.48	0.30	0.05	0.33	0.25
WSC14	0.06	0.08	-0.05	0.00	-0.13	0.15	0.10	0.01	0.25	0.01	0.19	0.55	0.16	0.26	0.17	0.35	0.37
WSC15	0.00	0.04	-0.02	0.02	-0.07	0.01	0.05	-0.02	0.25	0.08	0.16	0.54	0.15	0.22	0.37	0.39	0.28
WSC21	0.19	0.11	0.27	0.36	0.19	0.39	0.39	0.28	0.37	0.26	0.26	0.65	0.67	0.44	0.29	0.52	0.35
WSC22	0.27	0.02	0.43	0.42	0.37	0.34	0.25	0.30	0.40	0.48	0.36	0.41	0.79	0.41	0.31	0.39	0.39
WSC23	0.35	0.19	0.21	0.42	0.36	0.40	0.30	0.14	0.21	0.40	0.35	0.54	0.78	0.28	0.33	0.39	0.43
WSC24	0.15	-0.01	0.24	0.25	0.28	0.24	0.32	0.30	0.25	0.53	0.37	0.25	0.73	0.31	0.21	0.31	0.11
WSC25	0.24	0.10	0.27	0.28	0.37	0.31	0.34	0.24	0.30	0.52	0.24	0.41	0.80	0.41	0.30	0.47	0.20
WSC31	0.12	0.11	0.24	0.03	0.08	0.15	0.12	0.01	0.50	0.16	0.29	0.38	0.21	0.75	0.19	0.30	0.16
WSC32	0.16	0.12	0.30	0.26	0.12	0.28	0.15	-0.01	0.59	0.21	0.31	0.47	0.35	0.80	0.26	0.45	0.33
WSC33	0.24	0.05	0.33	0.28	0.35	0.30	0.21	0.27	0.32	0.49	0.44	0.23	0.50	0.64	0.19	0.33	0.16
SP11	0.11	0.01	0.13	0.23	0.22	0.16	0.24	0.24	0.19	0.25	-0.01	0.17	0.34	0.22	0.82	0.48	0.34
SP12	0.20	0.13	0.19	0.16	0.20	0.17	0.29	0.23	0.21	0.24	0.00	0.27	0.37	0.28	0.79	0.39	0.36
SP13	0.10	0.11	0.01	0.08	0.09	0.11	0.08	0.05	0.15	0.11	0.23	0.30	0.18	0.16	0.68	0.50	0.56
SP21	0.28	0.16	0.26	0.41	0.42	0.39	0.32	0.12	0.35	0.44	0.22	0.47	0.60	0.40	0.58	0.79	0.46
SP22	0.14	0.25	-0.02	0.12	0.06	0.35	0.25	0.07	0.41	0.17	0.24	0.57	0.29	0.37	0.32	0.78	0.57
SP23	-0.13	-0.07	-0.01	0.03	0.07	0.03	0.09	0.17	0.34	0.31	0.28	0.34	0.28	0.30	0.39	0.58	0.37
SP31	0.34	0.32	0.10	0.18	0.26	0.47	0.32	0.34	0.12	0.26	0.14	0.36	0.42	0.29	0.37	0.47	0.79
SP32	0.06	0.17	-0.03	0.07	0.03	0.15	0.00	0.05	0.23	0.02	0.14	0.40	0.26	0.22	0.54	0.60	0.86

Table 8: Correlation among perspective scores (square root of AVE in diagonal)

Item	SML1	SML2	SML3	SML4	SML5	SLT1	SLT2	SLT3	SPPP1	SPPP2	SPPP3	WSC1	WSC2	WSC3	SP1	SP2	SP3
SML1	0.70																
SML2	0.81	0.77															
SML3	0.46	0.30	0.69														
SML4	0.39	0.20	0.48	0.84													
SML5	0.31	0.16	0.47	0.46	0.89												
SLT1	0.60	0.58	0.33	0.51	0.40	0.79											
SLT2	0.40	0.34	0.26	0.37	0.30	0.66	0.72										
SLT3	0.27	0.17	0.18	0.18	0.14	0.28	0.47	0.97									
SPPP1	0.16	0.11	0.33	0.32	0.19	0.27	0.11	0.11	0.74								
SPPP2	0.34	0.14	0.35	0.40	0.44	0.32	0.34	0.29	0.52	0.75							
SPPP3	0.07	-0.02	0.17	0.30	0.28	0.20	0.02	0.01	0.58	0.45	0.76						
WSC1	0.27	0.20	0.24	0.23	0.12	0.40	0.39	0.22	0.47	0.33	0.36	0.68					
WSC2	0.32	0.11	0.38	0.46	0.42	0.45	0.43	0.33	0.41	0.58	0.42	0.61	0.75				
WSC3	0.24	0.13	0.40	0.27	0.25	0.34	0.22	0.12	0.64	0.40	0.48	0.49	0.49	0.73			
SP1	0.18	0.11	0.14	0.21	0.22	0.19	0.26	0.22	0.24	0.26	0.10	0.32	0.39	0.29	0.76		
SP2	0.17	0.18	0.12	0.28	0.28	0.38	0.33	0.16	0.50	0.43	0.34	0.64	0.56	0.50	0.61	0.72	
SP3	0.23	0.29	0.04	0.15	0.16	0.35	0.17	0.22	0.22	0.15	0.17	0.46	0.40	0.30	0.55	0.65	0.83

Table 9: AVE, CR, and CA values

Perspective	AVE	Composite Reliability (CR)	Cronbach's Alpha (CA)
SML	0.51	0.84	0.85
SLT	0.65	0.84	0.88
SPPP	0.67	0.86	0.89
WSC	0.66	0.85	0.85
SP3	0.73	0.89	0.81

6.5 Structural equation modelling using PLS: hypotheses testing

After the measurement of the safety performance BSC has been successfully validated through EFA and PLS, the structural framework can be analysed using SEM to determine the significance of the paths and the predictive power of the framework. This statistical technique was selected for the treatment of the previously explained EFA and PLS results. The technique includes structural equation modelling, along with a focus on the special form of SEM known as partial least squares.

According to Wetzels et al. (2009), PLS path modelling can be used to estimate the parameters in a reflective, hierarchical framework perspective. The second order in the conceptual framework perspectives also comprise several first-order factors (Wetzels et al., 2009). To illustrate the assessment of a reflective, third-order hierarchical framework, PLS has been used through conceptualisation (Mathwick, Malhotra, & Rigdon, 2001). Figure 2 presents the conceptual safety performance BSC orders and also shows the loading of each factor to its perspective. The loading for each factor was higher than 0.05 (Chin, 1998b), which was acceptable.

Figure 2: Conceptual safety performance BSC framework hierarchy

The different criteria for assessing a PLS framework on the structural level are summarised in Table 2. The first essential criterion for the assessment of the PLS structural equation model is each endogenous perspective's coefficient of determination (R^2). R^2 measures the relationship of safety performance BSC perspectives, which explains the perspective with regard to its total factors. To obtain a minimum level of explanatory power, the values should be sufficiently high for the framework. A value of approximately 0.670 is considered

substantial, whereas a value of approximately 0.333 is average and a value of 0.190 and lower is weak (Chin, 1998b) (see Table 10).

The next step in the structural framework assessment is the evaluation of the path coefficients between the framework's perspectives. Because PLS makes no distribution assumptions, to test the effects and statistical significance of the path coefficients, the bootstrapping re-sampling technique was used (Macmillan, Money, Money, & Downing, 2005; Ribbink, Van Riel, Liljander, & Streukens, 2004; White, Varadarajan, & Dacin, 2003). Five-hundred random samples from the original data set were generated to conduct the bootstrapping process (Macmillan et al., 2005; Wixom & Watson, 2001). The path coefficient's algebraic signs, magnitude, and significance were checked. Contrary to the theoretically assumed relationship, the signs' paths do not support the prepostulated hypotheses (Wetzels et al., 2009). Wetzels et al. (2009) also indicate that the strength of the relationship between perspectives can be measured by the path coefficient's magnitude. Several authors, e.g., Huber et al., (2007), suggest that path coefficients should exceed 0.100 to account for a certain impact within the framework. Additionally, at least at the 0.050 level, path coefficients should be significant. Re-sampling techniques such as bootstrapping (Efron, 1979; Efron & Tibshirani, 1994) have been used in this study to determine the significance. Moreover, according to (Chin, 1998a, 1998b), the bootstrap critical ratios determine the stability of the estimates, and the ranges between -1.96 and +1.96 were acceptable. Alternately, the average variance accounted for (AVA) represented the average of R^2 of the structural framework and indicated the overall predictive power of the framework (Fornell & Bookstein, 1982). In this study, the AVA for the endogenous variables was 0.38, and the R^2 values for the predicted variables were all greater than Falk & Miller's (1992) recommended level of 0.10; therefore, it was appropriate to examine the significance of the paths associated with these variables. Falk & Miller (1992) recommend a level of 0.015, and in this study, all of the paths were above the recommended level; additionally, all variables had bootstrap critical ratios above the acceptable level (greater than 1.96, $p < 0.05$).

Based on the observed p values, Table 9 contains the extracts from statistical tables that are used for specifying the significance level. The table also contains the critical p values for rejecting the unacceptable hypotheses at different levels of significance and for 1-tail and 2-tail tests. However, Venaik suggests that the observed p values are comparable to the critical p values in the table, given that when the sample size is large, the observed p values can be

approximated as p values (Venaik, 1999). Furthermore, Sørensen et al., (2004) suggested used 2-tailed to obtain a clearly directional hypothesis.

Table 9: Critical z-values for 1-tail and 2-tail tests

Sig. level (p)	Symbol	Critical z-values	
		1-tail test	2-tail test
0.001	****	3.090	3.290
0.010	***	2.326	2.576
0.050	**	1.645	1.960
0.100	*	1.282	1.645
Not significant	n.s	-	-

An additional important step, the goodness-of-fit (GoF) test, has been applied to the SEM assessment. Tenenhaus et al., (2005) define this test as the geometric mean of the average communality and average R^2 for endogenous perspectives. These researchers suggest the global fit for PLS path modelling of more than 0 and less than 1 ($0 < \text{GoF} < 1$). Because communality equals AVE in the PLS path modelling approach, Wetzels et al., (2009) propose a cut-off value of 0.5 for communality, as suggested by Fornell & Larcker (1981). As Cohen (1988) propose in line with the effect sizes for R^2 (small: 0.02, medium: 0.13, and large: 0.26), the following GoF criteria for small, medium, and large effect sizes of R^2 are obtained by Wetzels et al., (2009) by substituting the minimum average AVE of 0.50 and the effect sizes for R^2 in the following equation: $\text{GoF} = \sqrt{\text{AVE} * R^2}$. $\text{GoF} = 0.1$ is considered as small, $\text{GoF} = 0.25$ as medium, and $\text{GoF} = 0.36$ as large. For validating the PLS model globally, these scales may serve as baseline values (Wetzels et al., 2009). Table 10 details the hypotheses of the study, the path coefficient between the exogenous and endogenous perspectives, the average variance extracted, the average account for R^2 , and bootstrap critical ratios, which were acceptable, and the GoF, which was large.

Table 10: PLS results for hypotheses testing

Dependent (predicted) Variables	Independent (predictor) Variables	Hypotheses	Path coefficient (β)	Critical Ratio (CR)	Sig. level (p)	Tails	R^2	AVE	GoF
SLT	SML	H1	0.618	6.472	****	2-tail	0.38	0.65	0.50
SPPP	SML	H2	0.443	3.677	****	2-tail	0.20	0.67	0.37
WSC	SLT	H3	0.319	3.709	****	2-tail	0.53	0.66	0.59
	SPPP	H4	0.566	7.773	****	2-tail			
SP	WSC	H5	0.636	8.526	****	2-tail	0.40	0.73	0.54
AVE							0.38		

An additional assessment of the structural framework involves the effect size f^2 . Cohen's f^2 was computed to assess the effect of each set of predictors while controlling for all other factors in the framework; f^2 of 0.02, 0.15, and 0.35 reflect small, medium, and large effect sizes, respectively (Cohen, 1988). The value of f^2 can be calculated according to Eq. 1.

$$f^2 = \frac{R^2(\text{included}) - R^2(\text{excluded})}{1 - R^2(\text{included})} \quad (1)$$

In the above, R^2_{included} and R^2_{excluded} are the R-squares that provide the dependent perspective when the predictor factor is used or omitted in the structural equation, respectively. Table 11 shows that there was a large effect on size between each factor and its perspective.

Table 11: Effect size for the structural relationships

Factor	Perspective	R^2		f^2	Effect size
		Included	excluded		
SML 1	SML	0.99943	0.96226	>0.35	large
SML 2		0.99943	0.98381		
SML 3		0.99943	0.96198		
SML 4		0.99943	0.97773		
SML 5		0.99943	0.97809		
SLT 1	SLT	0.99997	0.80922	>0.35	large
SLT 2		0.99997	0.95791		
SLT 3		0.99997	0.98140		
SPPP1	SPPP	0.99974	0.81779	>0.35	large
SPPP2		0.99974	0.92887		
SPPP3		0.99974	0.99108		
WSC1	WSC	0.99990	0.93732	>0.35	large
WSC2		0.99990	0.87337		
WSC3		0.99990	0.96735		
SP1	SP	0.99923	0.93041	>0.35	large
SP2		0.99923	0.92880		
SP3		0.99923	0.95705		

Finally, an assessment of the structural framework involves the framework's capability to predict. The predominant measure of predictive relevance is Stone–Geisser's Q^2 (Geisser, 1975; Stone, 1974), which postulates that the framework must be able to adequately predict

each endogenous latent perspective's items. The Q^2 value is obtained by using a blindfolding procedure, a sample reuse technique that omits every d th data point and uses the resulting estimates to predict the omitted portion (Chin, 2010). Notably, the omission distance d must be chosen so that the number of valid observations divided by d is not an integer. Hair, Ringle, & Sarstedt (2011) indicate that the omission distance d values commonly range from 5 to 10.

The blindfolding procedure is only applied to endogenous latent constructs that have a reflective measurement framework specification. Q^2 comes in the following two forms: the cross-validated redundancy and communality. Hair et al., (2011) recommend using the cross-validated redundancy, which unlike the cross-validated communality, uses the PLS-SEM estimates of both the structural framework and the measurement frameworks for data prediction and, thereby, perfectly fits the PLS-SEM approach. Moreover, Chin (2010) suggests that $Q^2 > 0$ implies that the framework has predictive relevance, whereas $Q^2 < 0$ implies a lack of predictive relevance. Table 12 shows that the values of cross-validated redundancy represented by Q^2 , which can be obtained from the SmartPLS output, were found to range from 0.298787 to 0.436045. The results indicated that SML, SLT, SPPP, WSC, and SP have predictive relevance to BSC. In sum, the results signified the research framework has a good predictive relevance.

Table 12: Blindfolding results

Perspective	Omission Distance (d) = 5		Omission Distance (d) = 10	
	Cross-validated communality Q^2	Cross-validated redundancy Q^2	Cross-validated communality Q^2	Cross-validated redundancy Q^2
SML	0.311259	0.299755	0.311108	0.298787
SLT	0.436045	0.427943	0.436036	0.431652
SPPP	0.404610	0.391293	0.404565	0.395948
WSC	0.363917	0.351628	0.363890	0.355287
SP	0.428356	0.412933	0.428318	0.421140

6.6 Hypotheses testing summary

The SEM analysis results of the proposed framework provide support for the five hypotheses for the inner framework. Table 13 presents the results of the hypotheses testing. The proposed

framework, with an illustration of the path coefficients within the inner framework and R squared values for the endogenous perspectives, is presented in Figure 3.

Table 13: Hypotheses testing results summary

No.	Hypotheses	Results
H1	Safety Management and Leadership has significant effect on SLT	Supported
H2	Safety Management and Leadership has significant effect on SPPP	Supported
H3	Safety Learning and Training has significant effect on WSC	Supported
H4	Safety Policy, Procedures, and Processes has significant effect on WSC	Supported
H5	Workforce Safety Culture has significant effect on Safety Performance	Supported

Figure 3: Causal relationship between school safety BSC perspectives

7. Conclusions

In the past two decades, several research studies have attempted to examine and/or create a framework for school safety performance processes. However, none of these existing frameworks can be immediately adopted to explain the causal safety system performance process in Saudi schools. There also were numerous applications of the balanced scorecard in measuring safety performance, although none of these applications can be used to examine school safety in Saudi Arabia. In an attempt to fill this gap in knowledge, this study developed a balanced scorecard framework for safety performance in Saudi schools that captures all of the relevant perspectives that influence the effectiveness of the safety performance process. Additionally, the developed framework provides evidence that the knowledge level of Saudi teachers, school executives, and Ministry of Education officers has improved after implementing safety performance BSC initiatives.

This paper details the results of the development and measurement scale analysis through the conceptual safety performance BSC framework, the assessment of scale reliability, and an exploratory factor analysis of the survey data. The study also confirms the structure of the perspectives and their causal relationship using PLS-based structural equation modelling.

The measurement scale analysis was conducted to identify the structure among the set of measurement items for each perspective in the framework and also to reduce the data. The conceptual definition, dimensionality, reliability, and face validity for these scales were established through EFA. In two sequential stages, the PLS framework was then analysed and interpreted. In stage one, the reliability and validity of the measurement framework was presented, and in stage two, an examination of the structural framework was undertaken by interpreting the path coefficients and identifying the adequacy of the research framework. Importantly, the results of the measurement framework indicated that all perspective measures were reliable and valid. Furthermore, the results of the structural framework analysis indicated that all research hypotheses were supported.

Traditional safety management practices in many Schools, particularly in developing and newly industrialized countries such as Saudi Arabia, are often solely focused on incident and accident orientated performance indicators. This approach to safety management has meant that safety performance improvement has been slow. Purely focusing on current safety performance outcomes often meant that the enabling indicators of future safety performance such as safety leadership, training, policies, procedures and culture, were not adequately addressed. This study provides empirical evidence of the causal relationships between the leading and lagging perspectives of safety performance. Specifically, it shows that the Saudi Ministry of Education needs to examine, monitor and evaluate the entire safety system within their burgeoning number of schools. By considering all the perspectives of the developed safety BSC system developed herein, and through an understanding of their causal relationships, they will be able to map out a streamlined path to achieving the safety goals of the Ministry and country. Taking a systems view of safety for public schools in Saudi Arabia will undoubtedly achieve these desired goals in a shorter time.

8. Study limitations

Despite the large number of studies addressing the concept of safety, little research has focused on the safety performance BSC process in schools. Furthermore, to the best of the researcher's knowledge, such research investigations have not resulted in the development of a statistically verified safety performance BSC framework for Saudi schools. The new framework provides a systematic approach that the Saudi Ministry of Education can implement to minimise school accidents and incidents. Although the current research method was exhaustive, and permitted the generation of the most comprehensive safety performance BSC framework possible, the research had a few limitations, such as, the lack of Saudi Ministry of Education department officers in some cities, or in the different geographical regions in Saudi Arabia, constrained the number and location of appropriate study sites. Hence, the study was limited to large population cities (i.e. Riyadh, Dammam, Jeddah, Hail, and Abha). To enable the wider application, and to gain a better generalisability, the new safety performance BSC framework would benefit from being tested on a larger sample size, as well as a more diverse sample diversity, especially in terms of regional location and cultural context.

Also, the developed structural equations within the safety performance BSC framework were only applied in Saudi Arabia. Hence, they need to be tested within education sectors in other countries. It is expected that the outcomes will differ, depending on the maturity of the host nation and its education sector, and the strength of the relationship in the verified safety performance BSC framework. Finally, the safety performance items were evaluated only through a quantitative assessment scale. Thus, the findings could be enhanced through the application of a qualitative assessment; this analysis could improve the strength of adopting the benchmarking method.

Finally, the present BSC framework and causal links verified in this study are linear (Figure 3) where in practice some are complex two-way relationships that interact over long periods of time. The research method adopted (i.e. single snapshot measurement using questionnaire survey) limited the findings to those presented in Figure 3. However, a longitudinal study over many years could enable the formulation of functions explaining all direct relationships and also feedback loops, enabling the creation of a more sophisticated Systems Dynamic model. Robust SD models require extensive data collection over many years, which was outside the scope and budget of this present study. Nonetheless, the present study begins to unpack evidence that safety in schools needs to be thought about more systematically. Relying solely on measuring incidents and accidents will not improve safety performance; instead the focus must be on the upstream enablers of better safety performance such as safety leadership, training, policies and procedures, to name a few.

9. Implications and future research

This research study has a number of implications for the Saudi Arabian educational sector that is attempting to develop and promote an effective safety performance process in across their rapidly growing portfolio of primary, elementary and secondary schools. The developed method is particularly important for publicly funded schools in which the Saudi Ministry of Education is concerned. It is hoped that advanced safety monitoring and management approaches such as this will be willingly and effectively transferred to teachers, school executives, and Ministry of Education officers. The safety performance BSC framework should be considered as the initial foundation for a more comprehensive approach. The developed framework may also be of particular interest to multilateral funding agencies such as the United Nations Educational, Scientific and Cultural Organisation (UNESCO), which might seek tools to better monitor the performance of the school safety process when the organisation provides services to schools in developing countries.

Study findings and implications provide a solid foundation for future work. Future work includes the application of the developed safety performance BSC framework through numerous case studies in Saudi schools in order to validate the framework perspectives and their causal linkages. Also, causal mapping at the item level adopting the interpretative structural modelling approach is proposed in order to intricately map the Saudi school safety system. Furthermore, a systematic benchmarking approach will be developed based on the perspectives, factors and items of the safety performance BSC framework and will be applied to longitudinally monitor the safety performance of the Saudi schools of different characteristic groups (i.e. region, gender, type, etc.). Safety performance benchmarking and its longitudinal monitoring will assist the Ministry of Education to focus on deficient critical lagging factors that may need to be improved in order to boost leading indicators of safety performance such as incidents and accident rates. Also, an SD model could be formulated with this extensive longitudinal dataset enabling Ministry of Education officers to better prioritise strategies for sustainably enhancing safety performance over the long term.

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