Dumper Operator's Workplace Risks: Preliminary Study

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ABSTRACT

In previous research is stated that the most common cause of accidents and/or incidents in dumpers' operation is human error. Due that fact, the aim of this paper is directed towards preventing accidents and/or incidents in dumper operations that originate from the operator's error and which could be mitigated by the ergonomic adjustment of the workplace. Specifically, the purpose of this study is to utilize artificial neural networks in order predict the probability of incidents and accidents on the basis of dumper operators' workplace ergonomic intervention. In this research the sample of 1800 data was collected and 40 dumper operators participated, who, in addition to their personal data gave answers to 14 survey questions. The obtained data were statistically processed and according on the responses that the dumper operators gave to the questions regarding workplace ergonomic adjustment, the most significant difficulties that they face were identified. The key research results indicate the possibility of predicting accidents and/or incidents based on poor ergonomic design of the seat, which appeared as the main cause of the reduction in the quality of the working conditions of dumper operators.

Keywords: Dumper, Operators, Ergonomic adjustment, Statistical analysis, Neural network

INTRODUCTION

Mining as a long recognized high-risk sector still has a relatively high rates of fatalities and injuries according to accident statistics (Noraishah Ismail et al., 2021). Additionally, the effects of post-mining accidents have a negative impact on the environment and landscape change (Bian et al., 2010; Mirzaei Aliabadi et al., 2020; Noraishah Ismail et al., 2021).

Accidents in mining industry are caused mainly by operator's faults and human faults jointly (Kumar et al., 2014). Over 90% of mining accidents reportedly involve human error due to the lack of ergonomic consideration in the design of mining machinery and equipment (Foster et al., 2004; Simpson et al., 2009). Certain authors add that risk-taking behaviour of dumper drivers is influenced by situational circumstances, such as site safety regulations or the actions of other workers, as well as a general culture that puts productivity over safety (Bohm et al., 2010).

Ergonomic concerns, evidently, have frequently been disregarded in the past when designing mining equipment. Issues like poor control design and placement, difficult entry and egress, and inaccurate population stereotypes not only have an impact on safety directly, but also on efficiency and performance standards (Foster et al., 2004). Evidently, mining has paid considerably less attention to and implemented ergonomics less than other sectors, such manufacturing (Dempsey et al., 2018).

The dumper vehicle is essential for carrying out material handling activities in the mining industry (Ramar et al., 2023) and they are the primary cause of fatal accidents at both construction and mining sites (Bohm et al., 2012; Duarte et al., 2021). According to earlier studies, the vast majority of these incidents are caused by the operator's behaviour (Bohm et al., 2012). More than 50% of absences for medical reasons are attributable to musculoskeletal issues as a result of these challenging and dynamic environments, and there are no set guidelines that apply to everyone (Apud, 2012). Also, it is well known about positive effects of participative ergonomics application in terms of workers' increased productivity and comfort (Leber et al., 2018; Vink et al., 2006).

Due those facts, the aim of this paper is to investigate the causes of the occurrence of undesired events (accidents and/or incidents) among dumper operators that originate from the ergonomic adjustment of the workplace to the needs of dumper operators and can lead to the occurrence of human error (e.g. poor visibility, vibrations, noise, air pollution by exhaust gases, maladjusted controls, lack of lumbar support, etc.). The goal of the research is to understand the influencing factors on the occurrence of human error among dumper operators, which originate from the ergonomic adjustment of the workplace, to prevent future unwanted events (accidents and/or incidents) on this heavy machinery.

The paper is structured as follows: an overview of previous research in order to investigate the key factors that influence an ergonomically adjusted workplace for dumper operators, generation of a survey questionnaire, data analysis: descriptive statistics and trained artificial neural network to forecast the likelihood of an accident by analysing the operator's feedback pertaining to the ergonomics of the cabin seat, and drawing conclusions about the potential for better ergonomic adjustment of the dumper operator's workplace.

PREVIOUS RESEARCH

Although dampers are primary cause of accidents in mining industry, with a human error as the most frequent reason of accidents, there is not enough attention paid to ergonomics issues there.

Mandal and Srivastava (2010) evidenced that operators of dumpers are subject to whole-body vibration and in terms of root mean square acceleration, with magnitude along the prominent Z-axis ranged from 0.644 to 1.82 m/s2 and consequently with low back pain (85%), neck (37.5%), shoulder (30%), and ankle (37.83%) pain and lower quality of life. Upadhyay et al. (2022) add that the majority of dumper operators were taking awkward postures and 58–74% of them were subjected to high and medium levels of musculoskeletal disorders. Ramar et al. (2023) investigated the dumper operator discomfort during operations such as material-loading, loaded-travel, material-unloading and unloaded-travel, and found that study population is more likely to have neck pain and back pain due to the demand for a large number of operation cycles and proposed to optimize the performance of seat design by using computational learning technique support vector machine classifier.

Kunar et al. (2021) claim that according to data gathered for the RULA and REBA assessments, the actions carried out by dumper drivers put them at a high risk of injuring their muscles and skeleton, and the inappropriate position they assume when loading and unloading could have an adverse effect on their wrists and neck. Kar et al. (2023) also pay attention to postural risk of dumper operators and their findings showed that 20% of the driving postures used by dumper operators are associated with a medium risk of musculoskeletal diseases at work. Eger et al. (2008) analysed dumper mining vehicles and found that operators drove with their necks rotated greater than 40 degree over 89% of the time.

Mandal et al. (2020) show analysis of seat vibrations of two different types of dumpers in opencast mines and include the six operators in their study. Village et al. (1989) included in their study 11 vehicles and 8 dumper operators and found that driving full and empty was faster than mucking and dumping in the x and z directions and exceed the ISO exposure limit for health or safety. Therefore, while developing future exposure standards for dumper operators, it is important to take into account the role that nonneutral working postures and whole-body exposure play in the development of musculoskeletal injuries.

It is evident that research in the field of this paper is rare. Also, sample sizes in all previously mentioned studies were small, beside study Mandal and Sristava (2010), so future research on larger samples, containing over 30 operators in the sample, is needed.

METHODOLOGY AND RESULTS

Spasojevic Brkic et al. (2023) proposed the 39-item checklist, which is based on prior research, and demonstrated the validity of its using 102 transport, construction, and mining machines as a sample. These machines included cranes, excavators, bucket wheel excavators, bulldozers, loaders, graders, backhoe loaders, trenchers, dumpers, and scrapers.

The aforementioned list was used in the research and 40 dumper operators were surveyed in order to collect data on the ergonomic adjustment of the workplace to their needs. Table 1 provides descriptive statistics of the research sample.

	Age (years)	Height (cm)	Weight (kg)	Work experience (years)	Age of the machine (years)
Mean value	36.33	178.35	90.33	11.93	5.93
Standard deviation	8.53	5.45	17.57	10.03	3.85
Median	36.00	178.00	86.50	10.00	6.00
Maximum	54.00	188.00	135.00	38.00	12.00
Minimum	19.00	166.00	60.00	1.00	1.00

Table 1. Descriptive statistics of the research sample.

In order to see the age pyramid of the sampled dumper operators, age groups were generated and a normal distribution can be observed in the research sample, Figure 1a. A similar distribution is also present in the pyramid according to the height of the dumper operators, Figure 1b.



Figure 1: a) Age pyramid of dumper operators b) the height of dumper operators.

Normal distributions, represented with (1) by age and height of dumper operators indicate that we a relevant research sample regarding these variables, which can provide us with reliable results when examining the dependence between the factors of ergonomic adjustment of the workplace to the needs of dumper operators and the aforementioned variables.

$$f(x) = \frac{1}{\sigma\sqrt{2\pi}}e^{-\frac{1}{2}\left(\frac{x-\mu}{\sigma}\right)}$$
(1)

$$f(x;\lambda) = \lambda e^{-\lambda x}; x > 0, \ \lambda > 0$$
⁽²⁾

Regarding the pyramid of distribution by variables, the weight of the dumper operators and the years of work experience of the dumper operators, no normal distribution was recorded, Figure 2a and 2b. Regarding the weight of dumper operators, we have deviations in the category over 110 kg, that is, more dumper operators with excessive body weight, while with years of work experience we have an exponential dependence, represented with (2), which indicates a greater representation of dumper operators with fewer years of work experience.

In total, the sample included 40 dumpers (each examinee gave answers for his work machine). Generating the graph of the age distribution of the machines age also shows an exponential dependence, which speaks in favour of the fact that the research sample is represented mostly by newer generation machines, Figure 3.



Figure 2: a) Weight of the operators b) years of dumper operators' work experience.



Figure 3: The age of the dumper truck.

Results of survey showed, that questions with lowest percent of positive answers are questions related to seat rotation and armrests and they can be considered primary factors in the investigation of the ergonomic adjustment of the dumper operators' workplace. Additional conclusions refer to the absence of objections to vibrations, temperature in the cabin, poor visibility, which can be related to the age of the observed dumpers (average age of the machines is 5.93 years). Poor working conditions originating from organizational factors are also one of the important conclusions of the research. Results are shown in Table 2.

Question	Percentage share of the observed factor
The seat cannot be rotated	92.50%
There are no armrests	85.00%
Frequent absences from work due to poor working conditions	85.00%
The armrests are not adjustable	80.00%
The armrests are not at the right height	80.00%
Machine failures occur due to human error or organizational factors	62.50%

Table 2. Ranked factors of unfavourable working conditions of dumper operators.

Furthermore, a trained artificial neural network was utilized to forecast the likelihood of an accident by analysing the operator's feedback pertaining to the ergonomics of the cabin seat. Table 3 lists the questions that the operators responded to.

The training dataset consisted of 80% of the obtained data, while 10% was allocated for validation and the remaining 10% was reserved for testing purposes. Used network has one hidden layer with 12 neurons. The neural network underwent training for a total of 16 epochs. Notably, the 10th epoch yielded the best validation performance, as depicted in Figure 4.

Table 3. Questions used as in	put to the artificial	neural network.
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Question
Is the seat height adjustable?
Can the seat be adjusted horizontally?
Is the seat set at the correct height?
Does the seat have back support?
Does the seat have lumbar support?
Are there armrests?
Are the armrests adjustable?
Are the armrests placed at the appropriate height?
Do you feel vibrations through the seat?
Do you feel vibrations from the equipment through the floor?
Do you feel vibrations from the equipment through the control devices?
Is the seat firmly attached to the sub cabin?
Can the seat be reclined?
Can the seat rotate?



Figure 4: Neural network performances.

Regarding the outcomes, they are quite favorable. Training accuracy is 93.8%, validation 100%, and test 75%, resulting in an overall training accuracy of 92.5% on the dataset used. The data within the green diagonal of the confusion matrix represents instances that were correctly classified by the neural network. Conversely, the red regions outside the diagonal indicate cases that were misclassified by the neural network (Figure 5). Additionally, it is important to note that in the confusion matrix, a value of 1 indicates the presence of the possibility of an accident/incident occurring.



Figure 5: Confusion matrices.

CONCLUSION

Previous research show that the occurrence of human error among dumper operators often originates from the absence of ergonomic adjustment of the workplace and that this topic is very current and unexplored.

In the presented research, a large sample of 40 surveyed dumper operators belonging to different age groups and with different work experience was considered. The research used a survey instrument that contained 14 questions that covered the key influencing factors on the quality of the working conditions related to cabin seat of dumper operators in order to prevent possibility of accidents/incidents at the workplace caused by poor seat ergonomics.

The study revealed that the average age of dumper operator is 36.33 years old, and their height is 178.35 centimetres. In addition, despite the fact that their average weight is 90.33 kg, these body measurements, unlike the others which followed a Gaussian distribution, regardless of the average value indicate that there are a large number of operators who are overweight and weigh more than 110 kg. Furthermore, the vast majority of operators have less than ten years of experience in this domain. Regarding the machinery, most dumpers have less than 10 years.

Given that the results of the research showed that the questions to which the respondents had the worst answers related to the seat in the cabin, as well as the armrest, an artificial neural network was trained that predicts the possibility of accidents/incidents based on 14 different answers related to the seat and armrests. The correct classification of 92.5% of the data indicates a high prediction accuracy of predicting possible accidents/incidents.

The research conclusions point to the need for further research into an ergonomically adjusted workspace for dumper operators in terms of the possibility of overcoming the identified problems in further anthropometric studies and by applying modern information technologies such as the installation of sensors, monitoring and similar solutions.

A limitation of this study is the sample size, and additional data collection is ongoing. The proposal for further research is to gather additional data to make the analysis even more reliable, and perhaps examine other types of mining machines and determine if similar problems occur with them.

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