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Exoskeletons in Action: The Impact of Exoskeletons on Human Factors During Manual Material Handling

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ABSTRACT

In the last years, both industrial and academic researchers have been trying to explore the effectiveness of exoskeletons in supporting human workers during the execution of various tasks to highlight the benefits and opportunities but also the limitations of this technology. Today multiple types of exoskeletons have been developed to supply support to different body districts. The purpose of the study in this paper is to analyze the impact of an occupational passive back support exoskeleton during manual material handling. Specifically, the study evaluated the influence of the exoskeleton on physiological parameters and human factors, such as the pressure of the feet to the ground, the heart rate and the blood oxygen saturation, and the user perceptions about comfort and usability. The results show variations in the distribution patterns of the pressure of the feet to the ground and in the heart rate when the task is performed with and without the exoskeleton. This experimental study lays the foundations for an in-depth future study in which the findings can be investigated contributing to the growing body of knowledge in the field of human factors and ergonomics at work.

Keywords: Exoskeleton, Ergonomics, Human factors, Manual material handling, Human monitoring

INTRODUCTION

Recently, the interest in the study of the effects of exoskeletons on human health has increased considerably, as confirmed by the exponential growth in the number of scientific publications on exoskeletons published in the last ten years (Botti et al., 2023; De Bock et al., 2022; Young & Ferris, 2017). While the use and benefits of exoskeletons in medicine and rehabilitation are well known, the interest of both academic and industrial researchers has

grown toward their applications in previously unexplored fields, such as the use of exoskeletons to support workers who are required to perform multiple tasks. Exoskeletons used in the workplace may be, however, both an opportunity and a risk to workers' health (Botti & Melloni, 2023). On the one hand, exoskeletons can provide physical support and assistance, reducing the risk of stress injuries on the body during repetitive or strenuous activities. This can lead to increased productivity, satisfaction, and reduction of worker fatigue (Madinei et al., 2020a; Steinhilber et al., 2020). On the other hand, exoskeletons can also pose risks, especially if not properly used (Cardoso et al., 2020; Spada et al., 2019). Exoskeletons can be divided into two macrocategories. Active exoskeletons use actuators and external power sources to increase human strength, while passive exoskeletons are non-motorized exoskeletons made of different elastic materials that store the energy produced by human movements and return it to support the muscles in other movements (de Looze et al., 2016). The latter, mainly because of their lightness, cost, and reduced maintenance, compared to active exoskeletons, are being adopted and tested by a growing number of companies belonging to different sectors, and lately, also the number of companies that produce and distribute passive exoskeletons increased. This is confirmed by the high number of different models on the market and now available (Ashta et al., 2023). Passive exoskeletons, particularly those designed for lumbar support, are among the most extensively researched and developed types. These exoskeletons reduce the strain on the back muscles during manual handling of loads, particularly during lifting and lowering, which are major contributors to the development of musculoskeletal disorders. (HSE: Work-Related Musculoskeletal Disorders Statistics in Great Britain, 2023, 2023). Some of the most studied aspects in the academic literature on exoskeletons are perceptions of comfort and usability in addition to muscle fatigue, with electromyography (Madinei et al., 2020b; von Glinski et al., 2019; Wang et al., 2021), kinematics of movements (Madinei et al., 2020b; Wang et al., 2021), and metabolic consumption (Madinei et al., 2020). Other aspects studied in the literature are heart frequency (von Glinski et al., 2019) and the distribution of the pressure of the feet to the ground (Botti, Melloni, et al., 2023). Among the methodologies used to obtain subjective opinions, there are interviews, questionnaires, the Borg scale and Local Perceived Pressure evaluation (LPP) (Wang et al., 2021) and, finally, the system usability scale to evaluate usability and the Likert's scale (Pacifico et al., 2022).

This paper, which shows our research in progress, investigates the impacts of a passive occupational exoskeleton for lumbar support while performing a manual palletizing task. Specifically, the study evaluated the influence of the exoskeleton on various parameters and human factors, such as the pressure of the feet to the ground, changes in physiological parameters such as heart rate and blood oxygen saturation, and user perceptions about comfort and usability. The participants involved in the study performed the task with and without the assistance of the exoskeleton and subsequently the resulting data were compared and analysed.

The article is structured as follows: Section 2 describes the materials and the methodology used in the study; Section 3 presents and discusses the results obtained; then, the presentation of opportunities for future developments are in Sections 4.

MATERIALS AND METHODS

This preliminary study was intended to analyse the impact of a passive exoskeleton for lumbar support (Laevo V2), on different subjects, specifically the variation of physiological parameters and the pressure of the feet to the ground, during the execution of a lifting task. To do this, a task was created to simulate a palletizing activity that consisted of the lifting of 12 cardboard boxes (dimensions $44 \times 31.5 \times 28.5$ cm) each weighing 15 kg grabbing them from the bottom. The boxes that were originally placed on a Euro pallet (at a height of 14.4 cm) have been lifted and carried for 2 m from the pick-up point until the deposit point on another Euro pallet. The boxes are deposited to form 4 levels, of 3 boxes each, following a specific deposition scheme, aimed at simulating a typical palletizing mode, then going to deposit the carton first in position 1, then 2 and 3, and in the next level reverse the arrangement of the last box (Figure 1). The height of the hands of the users at the deposition was 14.4 cm (first level, L1), 42.9 cm (second level, L2), 71.4 cm (third level, L3) and 99.9 cm (fourth level, L4).

Figure 1: Scheme and sequence of deposit of the boxes on the four levels (L1, L2, L3, L4) on the pallet.

FlexInFit sensor baropodometric insoles were used to collect the data on the distribution patterns of the pressure of the feet to the ground (FlexInFit, 2023). Each insole contains 214 sensors. The insoles were placed inside the subjects' shoes and connected via Bluetooth to a personal computer. Data from the insoles were then processed with the FreeStep software developed by Sensor Medica for biomechanical analysis of posture, movement, and foot support (FreeStep, 2023). In addition, a pulse oximeter (Karaeas, Model: YK011) was used to measure blood oxygen and heart rate.

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Mean (SD)	Min	Max			
26.7(1.5)	25.0	29.0			
74.8 (6.0)	70.0	86.0			
42.8 (1.5)	41.0	45.0			
179.3(5.3)	171.0	184.0			

Table 1. Demographic and anthropometric data.

The study involved a panel of 6 participants (all males), who took part voluntarily in the experiment. The subjects were mainly researchers and PhD students from the Department of Engineering "Enzo Ferrari" of the University of Modena and Reggio Emilia, in Italy. Table 1 shows the average values and Standard Deviation (SD) of age, weight, height, and foot size of the subjects involved in the study. After an exhaustive initial explanation of the task and the purpose of the study to the subjects, a numeric code was assigned to every one of them to ensure the data anonymity, and anthropometric data, heart rate, and blood oxygen saturation values were collected in resting and sitting conditions. Next, the subjects wore the FlexInFit insoles Bluetooth connected to the PC running the software, and after the execution of an offset to reset the residual pressures, the task started running. After wearing the exoskeleton and fitting it on his body, each user was asked to perform simple actions to familiarize himself with the exoskeleton such as walking, bending the knees, leaning forward from the hip by pointing the hands towards the feet and tilting forward obliquely by stretching the arms forward. All the subjects were trained to the correct execution of the task, that was maintaining the box as close as possible to the body and avoiding rotations of the trunk during the lifting movement. After depositing 3 boxes, i.e., when a level is completed, the user must return to the starting position, the pressure recording is interrupted and the analysis of the pressure of the feet to the ground is collected. Then, the user picked a box and started a new level on the pallet. Four levels (L1, L2, L3 and L4) were completed during each task. At the end of the task, the heart rate and blood oxygen saturation values were collected again, and the subjects were asked to fill in a questionnaire. The questionnaire consisted of three sections. The first section aimed to collect data on the variation of the effort perceived during the execution of the task, using the Borg's scale (Borg, 1998). The second section used the Likert scale (Albert & Tullis, 2023) to collect the judgements of the users on the usability of the exoskeleton. Finally, the third section investigated the pressure perceived by the subjects in different body districts, i.e., shoulders, chest, pelvis, thighs, back, using the Locally Perceived Pressures (LPP) proposed in (Grinten & Smitt, 1992).

Each subject performed the task twice, i.e., the first time without and the second time with exoskeleton support. The panel was divided into two equal groups: one group performed the task first without and after with exoskeleton aid, other group performed the task first with and after without exoskeleton aid. The time between the two tasks was variable. Indeed, each subject started the second task when the heart rate and blood oxygen saturation returned to the values observed during the resting condition. Before

performing the task with the exoskeleton, the subjects were assisted in wearing and adjusting the device, based on the indications in the manufacturer's manual, adjusting the angle of inclination to the position most appropriate for the individual user. The same exoskeleton torso structure size was used for all the subjects (size M, Laevo).

RESULTS AND DISCUSSION

The parameters investigated in this study are the pressure of the feet to the ground, differences in two physiological parameters such as blood oxygen level and heart rate. In addition, general perceptions of comfort and usability were evaluated.

Figure 2 shows the average values of the percentage changes in the distributions of the pressures on both the forefoot (Figure 2a) and on the rear foot (Figure 2b) between the tasks performed with and without the exoskeleton aid. The values were calculated separately for each level of boxes on the pallet (L1-L4). Figure 2 positive values refer to the condition in which, on average, the percentage of distribution in an area in the test carried out wearing the exoskeleton is higher than the values collected during the test without the exoskeleton. The average pressure on the forefoot increased during the task with the exoskeleton when the users deposited the boxes on L1 and L2. The maximum percentage variation was 2.63% on the right foot in L1. Also, the average pressure on the right forefoot decreased when the subjects deposited the boxes on L3 and L4. The average pressure on the rearfoot decreased in L1 and L2 during the task with the exoskeleton. Specifically, the minimum decrease was -6.70% on the right rearfoot in L2. Generally, for both forefoot and rearfoot, there have been increments or decrements of bigger percentage variations for L1 and L2.

Figure 2: Variation of the pressures of the forefoot (top, a) and rearfoot (bottom, b), for different deposition levels (L1, L2, L3, L4).

This could be caused by the low height of deposition for L1 and L2 since users tend to move their centre of gravity forward by loading more on the forefoot to deposit boxes in L1 and L2. The presence of the exoskeleton would seem to lead to a slight increase in this trend in lifting mode. Data on the physiological parameters show no significant variation in the blood oxygen saturation of subjects after the execution of the task manually and with the exoskeleton (Table 2). On the other hand, significant variations were recorded in the heart rate.

User ID	Oxygen blood saturation			
	At rest	Without exoskeleton	With exoskeleton	
	97	97	97	
	99	98	98	
3	98	98	98	
	98	98	98	
	99	97	97	
	98	98		

Table 2. Oxygen blood saturation for the six users at rest condition, after the test without exoskeleton and after the test with exoskeleton.

Figure 3 shows the percentage differences in heart rate observed concerning the resting condition for the six test participants under the conditions wearing or not the exoskeleton. Figure 3a represents the heart rate percentage variation for the three users who performed the first of the two tests without wearing the exoskeleton. Vice versa, Figure 3b shows the heart rate percentage variation for the three users who performed the first test wearing the exoskeleton.

Figure 3: Heart rates percentage variation compared with the rest condition. (a) Heart rates percentage variation for users who performed the first of the two tests without wearing the exoskeleton, (b) the heart rates percentage variation for users who performed the first test wearing the exoskeleton.

For the first three subjects (Figure 3a) there was a maximum increasing variation of 35% during the test without wearing the exoskeleton and a maximum variation of 69% wearing it. All results regarding the three tests show a major variation in the condition of wearing the exoskeleton. For the other subjects, the maximum variation recorded was 50% during the test not wearing the exoskeleton and 53% for the test with exoskeleton aid (Figure 3b). These data suggest an increase in heart rate in the tests carried out with the use of the exoskeleton occurred in 67% of the subjects however the order of execution of the two tests, with and without exoskeleton aid, seems to affect the results. Moreover, the lifting frequency rate, which has not been measured, may have affected the test results in the tests with and without exoskeleton and affected the variation in the heart rate.

Finally, questionnaires revealed that all users already knew the exoskeleton technology, but only 33% of them had declared used it before.

Question	Indicate on a scale from 0 to 10 (in 0 "zero stress" and 10 "extremely heavy stress") the perceived value in each of the following situations WITHOUT the aid of the exoskeleton.					
Situation	Upright position	Walking	Squat	Lifting load		
Mean	0.2	3.5	4.5	5.0		
Question	Indicate on a scale from 0 to 10 (in 0 "zero stress" and 10 "extremely heavy stress") the perceived value in each of the following situations WITH the aid of the exoskeleton.					
Situation	Upright position	Walking	Squat	Lifting load		
Mean	1.3	3.7	3.2	3.2		

Table 3. Average values of perceived effort scores in different actions.

Table 3 shows the scores recorded by a Borg scale of the effort perceived during the execution of different actions wearing or not the exoskeleton. In maintaining the upright position, the subjects expressed an average score of 0.2 for the condition of not wearing the exoskeleton, while an average score of 1.3 wearing the exoskeleton. The effort in the walking action was given an average score of 3.5 not wearing the exoskeleton and 3.7 while wearing it. The squat actions were evaluated on average with a score of 4.5 not wearing the exoskeleton and 3.2 while wearing it. Finally, the load-lifting action stress perceived was evaluated with a value of 5.0 not wearing the exoskeleton and 3.2 while wearing it. These data show that the perceived effort to perform squats and load lifting actions decreases wearing the exoskeleton, while the effort felt during the walk remained essentially the same and the effort in the upright position increased slightly. Subjects found the device to be sufficiently comfortable and easy to use on average with Likert's scores of 2.7 and 3.7 although they found, with an average score of 3.3, that the device was an obstacle in some movements during the performance of the tasks.

Figure 4: Means values of LPP scale for the different body district.

Figure 4 shows the results of the evaluation of local pressures perceived on the LPP scale. In particular, the highest average perceived pressure was detected on the thighs, this is due to the presence of the leg bearings, with the value of 6.0. Furthermore, the perceived pressure was higher on the chest, where there was the presence of chest support in the sternal area, with an average value of 4.7. The other areas of contact such as the back, pelvis, and shoulders have recorded lower perceived pressures, with values of 2.3, 1.5, and 1.2, respectively. From these values, it is possible to assume that the body areas on which this exoskeleton (Laevo V2), acts most during use are the thighs and the chest.

CONCLUSION

This paper discussed our studies regarding the effects of a passive exoskeleton for back support while performing manual material handling. The study involved six participants who were asked to perform a manual palletizing task, wearing and not an occupational exoskeleton. The parameters investigated in this study were: the pressure of the forefoot and the rearfoot to the ground, and the variation of the users' physiological parameters, such as the blood oxygen saturation and the heart rate. In addition, perceptions about the exoskeleton's comfort and usability and the perceptions of the pressure exerted by the exoskeleton on different body districts were collected. Results suggest that the exoskeleton impacts the pressure of the feet to the ground when performing manual material handling. However, further research is needed to understand this phenomenon, also expanding the sample of users. The results from the analysis of the physiological parameters suggest that task execution wearing the exoskeleton determines an increase in the heart rate. However, these data may also have been influenced by the different lifting frequency rates, which have not been measured, wearing or not the exoskeleton, and could be partly related to the sequence of execution of the two tests (with and without wearing the exoskeleton). Finally, user perceptions obtained from the questionnaires, show that they perceived useful exoskeleton aid during the execution of the lifting movements. However, although

easy to use, users also highlighted that they felt limited during some movements, such as squatting, walking, and bending. Data on the perceptions of the contact pressures of the exoskeleton on the body show that the two areas most involved are the thighs and chest in the sternal area. Future developments of this study will further investigate the benefits and limitations of wearing exoskeletons at work. By expanding the sample of users, it will be possible to obtain a more representative data set and to further investigate the interaction of the exoskeleton with the body, it will be possible to measure the pressures exerted by the exoskeleton in the two areas that have been indicated as the most critical. Finally, the postures adopted by users during the task execution will be investigated to evaluate any changes induced by the exoskeleton in both the static and the dynamic postures.

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