Towards a model of human monitoring performance

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Abstract

Corresponding to prior research on the future of aviation, operators will have to monitor highly automated systems appropriately. Future personnel selection tests must address this skill. Eye tracking allows monitoring behaviour to be measured directly. In a previous study, we identified time sensitive eye-tracking parameters for selecting operators monitoring appropriately. Now, the question arises of how to capture human monitoring in the context of other human abilities. Data from an experiment with 90 job candidates were reanalysed and differentiated monitoring performance from other abilities and personality traits. The results show that monitoring performance explains independent portions of variance. Furthermore, monitoring performance has some small, significant relations to certain ability and personality factors. In conclusion, it is useful and important to measure monitoring performance in a separate test.

Zusammenfassung

Zukünftige Mensch-Technik-Interaktion beinhaltet das Monitoring hochautomatischer Prozesse. Diese Fertigkeit muss bei der Auswahl zukünftig geeigneten Luftfahrtpersonals berücksichtigt werden. Über Blickdatenerfassung kann Monitoring direkt gemessen werden. In einer Studie mit 90 Bewerbern für Luftfahrtberufe wurden geeignete Parameter der Überwachungsleistung identifiziert. In einer Reanalyse wurden Zusammenhänge mit anderen Leistungs – und Persönlichkeitsparametern untersucht. Die Ergebnisse zeigen, dass Monitoring eigenständig Varianz aufklärt, jedoch kleinere, signifikante Bezüge zu anderen Faktoren aufweist. Daher ist ein zukünftiger Test sinnvoll, der die Fertigkeit erfasst, hochautomatische Prozesse zu überwachen und bei Bedarf einzugreifen.

Introduction

According to the Single European Sky ATM Research (SESAR) Program, a high-performance Air Traffic Management (ATM) infrastructure will exist in Europe in the future. The DLR-project 'Aviator' deals with changes that will concern pilots and air traffic controllers in the future with the objective of adapting selection profiles to suit future ability requirements. Workshops were conducted with experienced pilots and air traffic controllers in order to gather their expectations about their future tasks, roles and responsibilities. They indicate that monitoring and teamwork in a highly automated workplace pose challenges to future operators in aviation (Bruder, Jörn & Eißfeldt, 2008). In the future, operators will have to monitor the dynamic processes of automated systems. The increase in automation requires operators monitoring appropriately (OMA), who are able to control the system manually when necessary. This raises the question of which parameters of monitoring behaviour help identify OMA who fit future human-machine systems in aviation.

Identifying operators monitoring appropriately

According to models of adequate and efficient monitoring behaviour (Niessen & Eyferth, 2001; Wickens et al., 2001) as well as differences between experts and novices (Underwood et

al. 2003), it can be stated that OMA demonstrate target-oriented attention allocation both in general and during monitoring phases, i.e. orientation phase, anticipation phase, operation phase, and debriefing phase. Whereas the first assumption requires the operator to adapt attention allocation to the specific requirements of a given situation in general, the second assumption focuses on allocation of attention in phases.

In a previous experiment we identified time sensitive eye-tracking parameters which are suitable to serve as basis for identifying OMA in future selections (Hasse, Bruder, Grasshoff & Eißfeldt, 2009a; 2009b). It is assumed that "good monitoring" is associated with accurate manual control of the system if the automation fails. Therefore performance when actively controlling is used as a criterion for predicting the validity of the eye-tracking parameters. As expected, there is a significant correlation between participant's appropriate fixations and manual performance ($r = -.214$; $p = .045$). Besides this substantial effect, the question arises of how to capture the construct of human monitoring in the context of other human abilities, especially those abilities required in aviation.

Identifying moderators of monitoring behaviour

Recent research suggests that the optimal monitoring and handling of automated systems depends on certain operator characteristics, such as personality traits and abilities.

The importance of complacency in human use of automation has been clearly established (Singh, Molloy & Parasuraman, 1993). Complacency addresses the risk of an inappropriate level of trust placed in the automation by a human operator (Lee & See, 2004). Such excessive trust can lead to over-reliance on the automated system, without recognising its limitations and the possibility of automation failure. Several studies have demonstrated that particularly highly and consistently reliable systems give rise to complacency effects (Singh, Molloy & Parasuraman, 1993). The more reliably an automated system works, the higher the potential for complacency (Prinzel, DeVries, Freeman & Mikulka, 2001). We assumed these attitudes to be also connected with monitoring performance. From this we hypothesize that complacency potential improves the predictive power of monitoring behaviour.

Ability tests are used to measure a broad range of knowledge a person brings to the job situation (Rathje, 2002). The pre-selection of the DLR's Department of Aviation and Space Psychology consists of a battery of tests covering all important abilities such as memory capacity, spatial orientation, concentration, attention, numerical abilities, personality as well as some knowledge-based aspects like English language competency and mechanical comprehension (Eißfeldt & Deuchert, 2002). Current ability tests for airline pilots and air traffic controllers measure the ability requirements which are needed to be successful under current training and job situations (Lorenz, Pecena & Eißfeldt, 1995). This raises the question of whether one's monitoring performance could be predicted by these ability tests as well. We assume that the DLR's tests concerning attention and concentration are related to monitoring behaviour.

Method

We have developed a simulation tool that allows the assessment of monitoring performance and its relation to other personality and ability factors.

Simulation tool

The simulation tool represents a traffic flow simulation (see Figure 1). The traffic flow simulation can be controlled either automatically or manually by a human operator. During the automatic phase, the system works fully automatically and the reliability is perfect. During manual phase, a human operator controls the dynamic traffic manually. This allows performance data to be collected separately for both types of tasks.
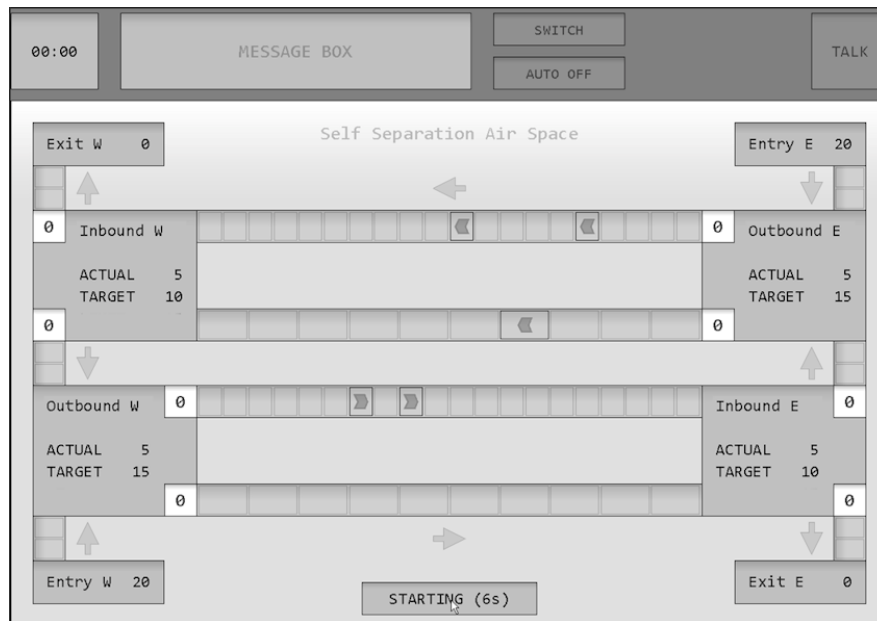
Fig. 1: Air traffic flow display of the MonT simulation.

The task of both the automated and human operator control settings is to bring all actual values into agreement with target values (for further information, see Hasse, Bruder, Grasshoff & Eißfeldt, 2009b). Four scenarios, each with a different degree of difficulty, were developed by varying the complexity and dynamics of the automatic system.

Measurements

Monitoring behaviour was measured by recording eye movements (for further information, see Eißfeldt et al., 2009). A test subject's performance was measured during the manual phase of each scenario. Complacency potential was surveyed using the questionnaire CaP (Complacency as Potential; Feuerberg, Bahner & Manzey, 2005). It consists of four scales reflecting technology-related attitudes (e.g. trust in technology, scepticism towards technology, enthusiasm about technology, locus of control using technology), and four scales concerning personality traits (unconcern/optimism, tolerance of ambiguity, self-efficacy, conscientiousness). Since all the participants were job candidates, ability test measurements, such as memory capacity, attention and concentration, were carried out anyway.

Procedure

Participants were first given the instructions for the experiment as well as a questionnaire measuring their complacency potential. They were informed they would work on four scenarios, each consisting of two phases: first an automated phase and then a manual phase. For the automatic phase of each scenario, participants were instructed to monitor the automated processes with the objective of understanding the rule-based dynamics of the given scenario. For the manual control phase, participants were instructed to manually control the same system they had seen during the automated phase. Eye movement parameters were recorded by the Eye Gaze Analysis System. After a calibration phase (15 s), they were presented with the four scenarios, each with a duration of five minutes. The four scenarios were presented in a fixed order for every subject, beginning with the easiest (Scenario 1) and finishing with the most complex (Scenario 4). After each scenario, subjects evaluated their difficulty and also reported the strategies they identified during the automated phase.

Participants

The experiment was conducted with a sample of 90 candidates for DFS (Deutsche Flugsicherung GmbH) and DLH (Deutsche Lufthansa AG) ranging in age from 17 to 26 years. 82% were male. Experiments were conducted in conjunction with the regular selection process at the German Aerospace Center's Department of Space and Aviation Psychology. Candidates received 20 € for participating and were assured that their performance in the experiment would not affect their selection results.

Results

First analyses indicate that scenario one and four did not differentiate sufficiently between participants. This is due to ceiling and floor effects. In contrast, scenario two and three show an optimal degree of difficulty. Therefore, results of these two scenarios are reported here.

The effects of complacency potential were analysed. To get an overview, the thirty participants with the best monitoring behaviour were compared to the thirty with the worst. The groups were identified according to their relative fixation counts on relevant AOIs during all operating phases. Contrasts were calculated between the extreme groups. No effect was found for technology-related complacency but the groups differed in the scales conscientiousness $(t(84)= 3.39, p<.01)$, and tolerance of ambiguity $(t(86)= -2.97, p<.01)$. Operators with good monitoring behaviour were significantly more conscientious and less tolerant towards ambiguity. These two significant parameters were involved in further analysis (see Table 1). Additional analysis using a stepwise multiple regression analysis found that tolerance of ambiguity directly influences the performance in the MonT simulation (Mahlfeld, Hasse, Grasshoff & Bruder, 2011). The lower the operator's value in this scale the better their performance. Conscientiousness has a moderating impact. The relationship between good monitoring behaviour and good performance increases at lower levels of conscientiousness.

Tab. 1: Results of multiple regression analysis with interactions

	Prediction of Performance			
	b	t	r	R2
Step 1				
Tolerance of Ambiguity			0.249	0.062*
Step 2				
Tolerance of Ambiguity	0.176	2.696**	0.376	0.141**
Interaction Monitoring Behaviour × Conscientiousness	0.163	2.686**		

n=81. * p<.05; ** p<.01; ***p<.001

In addition, the effect of the subjects' performance in the ability tests was analysed. Four tests were included in this analysis: a visual mental arithmetic test (WSB, attention & concentration), a mental concentration test (KBT, attention & concentration), a visual memory test (MEK, memory capacity) and an acoustic clearance test (CLE, memory capacity). Planned comparisons were performed between these ability tests and relative fixation counts on relevant AOIs during all operating phases. Ability tests of attention and concentration show consistent and significant correlations with monitoring behaviour. No substantial correlations between memory capacity tests and monitoring behaviour were found (see Table 2). Additionally, comparisons between ability test performance and manual control performance were calculated; neither substantial nor consistent correlations were found.

Tab. 2: Correlation analysis between ability test performance and monitoring behaviour.

		Attention & concentration		Memory capacity	
		WSB	KBT	MEK	CLE
Monitoring behaviour	Scenario 2	.36*	.25	.27	.20
	Scenario 3	.54***	.42**	.21	.18

* p<.05, ** p<.01, ***p<.001

Discussion & further research

To get a deeper understanding of operational monitoring performance, monitoring performance was related to other relevant parameters, such as candidates' complacency potential, ability test performance and personality traits. Summing up the results, monitoring performance explains variance independently. Furthermore, monitoring performance has a small, significant relationship with personality traits such as conscientiousness and tolerance of ambiguity, and ability tests such as attention and concentration. Consequently, the effect of personality traits should be taken into account. The relationship between monitoring behaviour and other factors are illustrated by a preliminary integrative model (see Figure 2).
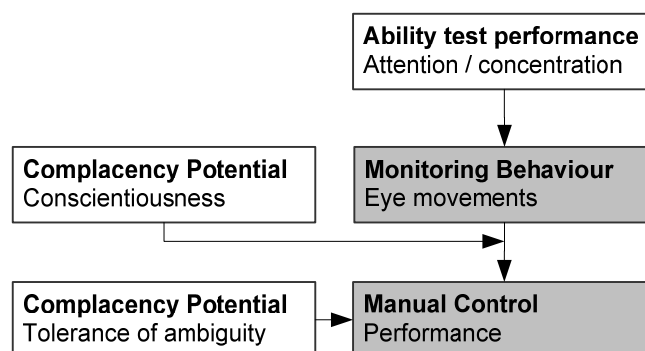
Fig. 2: Preliminary integrative model

The results show that ability testing using dynamic simulation based on eye movements is innovative and enables new approaches for assessing selection profiles. In this regard, the monitoring test (MonT) is introduced as an appropriate tool for investigating human performance in future ATM scenarios

As part of the follow-up project Aviator II, we continue to test human monitoring performance. Additional studies are planned to validate our model of adequate monitoring behaviour with experienced controllers and pilots. We plan to replicate this study using the identified monitoring parameters to confirm the effect of personality traits and ability test performance on monitoring behaviour and performance. Furthermore, a team version of MonT is planned, which will enable the assessment of team monitoring performance.

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