Original Paper

Usability Factors Associated With Physicians' Distress and Information System–Related Stress: Cross-Sectional Survey

Tarja Heponiemi¹, PhD; Sari Kujala², PhD; Suvi Vainiomäki³, PhD; Tuulikki Vehko¹, PhD; Tinja Lääveri⁴, MD; Jukka Vänskä⁵, MSocSci; Eeva Ketola¹, PhD; Sampsa Puttonen⁶, PhD; Hannele Hyppönen¹, PhD

Corresponding Author:

Tarja Heponiemi, PhD National Institute for Health and Welfare PoBox 30 Helsinki, 00271 Finland

Phone: 358 295247434 Email: tarja.heponiemi@thl.fi

Abstract

Background: Constantly changing and difficult-to-use information systems have arisen as a significant source of stress in physicians' work. Physicians have reported several usability problems, system failures, and a lack of integration between the systems and have experienced that systems poorly support the documentation and retrieval of patient data. This stress has kept rising in the 21st century, and it seems that it may also affect physicians' well-being.

Objective: This study aimed to examine the associations of (1) usability variables (perceived benefits, technical problems, support for feedback, and user-friendliness), (2) the number of systems in daily use, (3) experience of using information systems, and (4) participation in information systems development work with physicians' distress and levels of stress related to information systems (SRIS) levels.

Methods: A cross-sectional survey was conducted among 4018 Finnish physicians (64.82%, 2572 out of 3968 women) aged between 24 and 64 years (mean 46.8 years) in 2017. The analyses of covariance were used to examine the association of independent variables with SRIS and distress (using the General Health Questionnaire) adjusted for age, gender, employment sector, specialization status, and the electronic health record system in use.

Results: High levels of technical problems and a high number of systems in daily use were associated with high levels of SRIS, whereas high levels of user-friendliness, perceived benefits, and support for feedback were associated with low levels of SRIS. Moreover, high levels of technical problems were associated with high levels of psychological distress, whereas high levels of user-friendliness were associated with low distress levels. Those who considered themselves experienced users of information systems had low levels of both SRIS and distress.

Conclusions: It seems that by investing in user-friendly systems with better technical quality and good support for feedback that professionals perceive as being beneficial would improve the work-related well-being and overall well-being of physicians. Moreover, improving physicians' skills related to information systems by giving them training could help to lessen the stress that results from poorly functioning information systems and improve physicians' well-being.

(JMIR Med Inform 2019;7(4):e13466) doi: 10.2196/13466

KEYWORDS

health information systems; physicians; electronic health records; computers, digital



¹National Institute for Health and Welfare, Helsinki, Finland

²Aalto University, Espoo, Finland

³University of Turku, Turku, Finland

⁴Helsinki University Hospital and University of Helsinki, Helsinki, Finland

⁵Finnish Medical Association, Helsinki, Finland

⁶Finnish Institute of Occupational Health, Helsinki, Finland

Introduction

Background

The poor usability of information systems (IS)—such as problematic data entry and difficulties in use—has arisen as an important source of stress in physicians' work [1-3]. Moreover, a recent finding shows that the physicians' strain coming from the IS has kept rising in the 21st century [1]. Evidence implies that this strain may even affect the well-being of physicians [4.5].

Finnish physicians have given their electronic health record (EHR) systems rather critical ratings, depending on the working facility. When asked about the overall school grading for the EHR primarily in use, on a scale from 1 (*fail*) to 7 (*excellent*), the average ratings varied from 2.5 to 4.3 in 2010 and 3.2 to 4.4 in 2014 [6,7]. Recent findings from the United States showed that EHR design and use factors accounted for 12.5% of variance in measures of stress and 6.8% of variance in measures of burnout [8]. However, previous findings also showed that satisfied physicians who find their IS facilitate the continuity of care and make clinical information more accessible [9-11].

Usability problems with the current EHRs are common. Previous studies from the United States and Denmark showed over 100 usability problems, for example, related to consistency, user control, flexibility, and lack of support [12,13]. Poor IS usability and time-consuming data entry have been found as prominent sources of US physicians' professional dissatisfaction [5]. Moreover, technical problems in IS have been related to more experiences of time pressure and lower possibilities to control one's job [14]. Previous studies have also shown that physicians' stress emerging from the IS is related to cognitive workload and time pressures at work [1,15].

The use of the IS is further complicated by the multiplicity of screens and options and by the need to use many different systems. There are findings suggesting that a higher number of functions increase stress and job dissatisfaction [4]. In addition, the ever-changing new functionalities and systems need constant development of physicians' skills and time for orientation. Thus, being experienced in using different systems might help when facing challenges related to the IS.

Physicians' participation in the development work associated with the IS might help to tackle usability problems and improve physicians' attitudes toward the IS. However, physicians are dissatisfied with their impact possibilities and think that neither managers nor software providers are interested in end users' opinions [16].

Objectives

Thus, as mentioned above, the increasing use of IS in daily work is associated with many problems that stress physicians, and previous findings suggest that this might even have negative ramifications for physicians' general well-being. However, the evidence is still limited; there are no exact findings showing which factors related to IS and EHRs are the most stressful, and whether these problems are related to the actual well-being of physicians. Therefore, this study examined the associations of (1) usability variables (perceived benefits, technical problems,

support for feedback, and user-friendliness), (2) the number of systems in daily use, (3) experience of using EHRs, and (4) participation in EHR development work with physicians' distress and stress related to IS (SRIS).

Methods

The Study Sample

The data were collected in April 2017 [17]. The addresses were obtained from the Finnish Medical Association's register. A link to the study was sent via email to the target group that was all physicians younger than 65 years who lived in Finland (N=19,627). Altogether 93.37% (18,326/19,627) had provided email addresses to which the survey could be sent. The questionnaires were sent to all working-aged physicians with a cover letter calling for responses from physicians in clinical work. This was done because the Finnish Medical Association's membership register did not allow us to select only physicians in clinical work as the target population. Thus, the sample also included physicians who were not practicing clinical patient work at the time of the data collection. Those who answered that they did not do clinical patient work (n=48) were coded as *missing*.

The representativeness of the sample was assessed by comparing the distributions of the background variables with the corresponding distribution of the target population. The respondents were slightly older than the eligible population (the percentage of those older than 54 years was 31.65% (1266/3999) in the respondents, whereas it was 26.90% (5280/19,627) in the eligible population), more often female (64.81% (2572/3968) in the respondents and 61.09% (11,992/19,627) in the eligible population), and more often specialized (67.44% (2710/4018) in the respondents and 59.90% (11,757/19,627) in the eligible population) [18]. There were no significant regional differences between the respondents and eligible population according to the place of work [18]. Due to incomplete data in some variables, the n varied between 3744 and 3780 in different analyses.

The Context

There have been multiple reforms in Finland lately regarding IS in the health care sector. The public sector EHR adoption in Finland reached 100% in 2010, and the private sector adoption rates of EHRs are also high [19]. Finland has launched the national digital repository for electronic patient data, Kanta, in phases during the period 2012 to 2017. Kanta is targeted to health care service providers, pharmacies, and citizens. Kanta services include electronic prescriptions, My Kanta pages for citizens, a patient data repository, and an electronic prescription database. It is mandatory for all public health care providers to join Kanta and also for those private service providers that use electronic archiving.

Measurements

The measure items used in this study can be seen in Multimedia Appendix 1.

SRIS was used as a dependent variable and measured with the mean of 2 items, framed in 1 question that asked how often



(during the past half-year period) the respondent had been distracted by, worried about, or stressed about (1) constantly changing IS and (2) difficult, poorly performing information technology (IT) equipment or software. The answers were rated on a 5-point Likert scale ranging from 1 (*never*) to 5 (*very often*). The scale's reliability (Cronbach alpha) was .66 in this sample. This measure has previously been used and associated with, for example, employees' distress, cognitive workload, and higher levels of on-call duties [15,20,21]. In Finland, in addition to EHRs, a large number of separate IS are also in physicians' use, such as laboratory and radiological data systems, clinical decision-making software, and systems related to quality, patient safety, and security [22]. The wording of this measure refers to all these systems, not only to EHRs. The reliability of this scale (.66) can be considered low but acceptable given that the scale only included 2 items [23].

Psychological distress was used as a dependent variable and measured with the 4 items (alpha=.84) from General Health Questionnaire-12 (GHQ-12) [24] that represent anxiety/depression factor, as suggested by Graetz [25]. Graetz's 3-factor structure has been suggested to be the most preferable factor model for GHQ-12 [26]. The GHQ is one of the most popular and very widely used measures of mental health and minor psychiatric disorders. A variety of scoring methods can be used when using the GHQ. The bimodal scoring method allows identification of the threshold for pathological deviations. This study used Likert-scale answer options ranging from 1 to 4 with a continuous mean variable, higher scores indicating a higher level of distress. This scoring method was used to get more variation because we were interested in general well-being and distress levels (not in pathology) in the basically healthy working-aged physician population. We have previously associated this measure with, for example, physicians' collegial support, team climate, and patient-related stress [27,28].

The following variables were used as independent variables: The number of systems in daily use was assessed by asking about the number of clinical systems that the responder needed to log into on a daily basis when working with patients. The response options were 0/1/2/3/4/5 or "more"/"my work does not include clinical work" (coded as missing). For the analyses, this measure was coded as 0=1 to 2 systems in daily use (nobody answered that they had 0 systems in daily use) and 1=3 or more systems in daily use. Experience of using EHRs was assessed by asking how experienced the respondent was as an EHR user with a 5-point scale ranging from 1 (beginner) to 5 (expert). For the analyses, this variable was coded as 0=beginner (answer options 1-3) and 1=expert (answer options 4 and 5). Participation in the development work of the IS was assessed by asking whether respondent had participated in the development work of the IS. Answer options were as follows: plenty/a little/no. For the analyses, variable was coded as 0=no and 1=yes (answer options: plenty and a little).

The usability variables were used as independent variables in this study and represented the 4 strongest factors (perceived benefits, technical problems, feedback, and user-friendliness) with the highest loadings from a previous factor analysis that used 36 usability-related items among Finnish physicians [14]. These variables have previously been associated with physicians' time pressure and control [14]. The perceived benefits of the EHRs were assessed by 6 items (alpha=.79) asking, for example, how IS help to improve the quality of care. Technical problems was a topic assessed by 6 items (alpha=.81), for example, "Information entered/documented occasionally disappears from the information system." Feedback was assessed with 4 items (alpha=.78), such as "The system vendor implements corrections and change requests according to the suggestions of end users." User-friendliness was assessed with 9 items (alpha=.86) asking, for example, whether the arrangement of fields and functions is logical on the computer screen. These usability variables were rated on a 5-point Likert scale ranging from 1 (fully disagree) to 5 (fully agree). We analyzed technical quality and user-friendliness in separate analyses to avoid multicollinearity because these variables correlated (r=-0.65). However, a recent validation study showed that these dimensions are separate constructs and should be studied separately as well as that all these usability variables offer a useful tool to measure the usability of the health IS [29].

The adjustment variables used were as follows: *specialization status*, which was asked as *none/specialization is ongoing/specialist*. *Employment sector* was categorized into 3 groups: hospitals, primary care, and other sectors. Moreover, respondents were asked their age, gender, and which EHR system they mainly use.

Statistical Analysis

The association of independent variable levels with SRIS and distress was analyzed with analyses of covariance (in separate analyses). The analyses were conducted in 2 steps. In the first step, the analyses included adjustments variables (age, gender, employment sector, specialization status, and the EHR system in use), the number of systems in daily use, experience of using EHRs, and participation in IS-related development work. In the second step, usability variables (perceived benefits, feedback, and technical problems/user-friendliness) were added to the former model. The analyses were conducted in these 2 steps to find out whether usability variables would partly account for possible associations of the independent variables from the first step with SRIS or distress. User-friendliness and technical problems were analyzed in separate analyses to avoid multicollinearity.

Results

Characteristics of the Study Population

The characteristics of the study population can be seen in Table 1. The questionnaire was answered by 4018 physicians (64.82%, 2572/3968, women; response rate 21.9%) aged between 24 and 64 years (mean 46.8, SD 11.1). Almost half of the respondents worked in hospitals, and two-thirds were specialists. Over half of the respondents had 1 to 2 systems in their daily use and 71.82% (2886/4018) considered themselves as experienced in using EHRs.



Table 1. The characteristics of the study sample (N=4018).

Characteristic	Value
Gender, n (%)	
Men	1396 (35.18)
Women	2572 (64.82)
Employment sector, n (%)	
Hospital	1943 (48.59)
Primary health care	1070 (26.76)
Other	986 (24.65)
Specialist status, n (%)	
No	401 (10.00)
Specialization ongoing	907 (22.57)
Yes	2710 (67.43)
Systems in daily use, n (%)	
1–2	2375 (60.43)
≥3	1555 (39.57)
Experience in using EHRs ^a , n (%)	
Beginner	1111 (27.80)
Experienced	2886 (72.20)
Participation in IS ^b development, n (%)	
Not at all	2045 (51.34)
Yes	1938 (48.66)
Age, mean (SD)	46.76 (11.05)
SRIS ^{c,d} , mean (SD)	3.32 (0.92)
Psychological distress ^e , mean (SD)	1.83 (0.66)
Perceived benefits ^d , mean (SD)	2.77 (0.79)
Technical problems ^d , mean (SD)	2.83 (0.86)
Feedback ^d , mean (SD)	2.25 (0.91)
User-friendliness ^d , mean (SD)	2.81 (0.81)

^aEHRs: electronic health records.

Stress Related to Information Systems

Analyses of covariance showed that all the studied variables were significantly associated with SRIS (Table 2), but the association of participation in development with SRIS attenuated to nonsignificance after adjusting for usability factors. Those who had more than 3 systems in daily use (mean SRIS 3.47, SE 0.027) had higher levels of SRIS compared with those who had only 1 or 2 systems in daily use (mean SRIS 3.23, SE 0.022;

the means shown here are estimated marginal means with all adjustments). Those who had longer experience in using EHRs (mean SRIS 3.30, SE 0.022) had lower levels of SRIS compared with those who were beginners (mean SRIS 3.40, SE 0.029). High levels of technical problems were associated with high levels of SRIS, whereas high levels of user-friendliness, perceived benefits, and feedback were associated with low levels of SRIS. The study variables were able to explain much of the variance in SRIS given the rather high adjusted R squared (0.35).



^bIS: information systems.

^cSRIS: stress related to information systems.

^dThe scale ranged between 1 and 5.

^eThe scale ranged between 1 and 4.

Table 2. The results of the analyses of covariance for stress related to information systems.

Studied variables ^a	Model A		Model B	
	F test (df)	P value	F test (df)	P value
Number of systems in daily use	145.70 (1)	<.001	52.32 (1)	<.001
Experience of using EHRs ^b	12.22 (1)	<.001	13.73 (1)	<.001
Participation in IS ^c development	15.76 (1)	<.001	3.54 (1)	.06
Perceived benefits	d	_	95.13 (1)	<.001
Technical problems	_	_	719.50 (1)	<.001
Feedback	_	_	25.88 (1)	<.001
User-friendliness	_	_	376.86 (1)	<.001
R^2	0.082 (1)	_	0.349 (1)	_

^aAll analyses were adjusted for gender, age, employment sector, specialization status, and electronic health record in use.

Psychological Distress

The experience of using EHRs, technical problems, and user-friendliness were significantly associated with distress (Table 3). Those who were experienced users of EHRs (mean SRIS 1.82, SE 0.019) had lower levels of distress compared with those who were beginners (mean SRIS 1.92, SE 0.025).

High levels of technical problems were associated with high levels of distress, whereas high levels of user-friendliness were associated with low levels of distress. Even though technical problems had a rather strong association with distress, the studied IS-related variables were not able to explain much of the variance in distress given the low adjusted R squared levels of the models.

Table 3. The results of the analyses of covariance for distress.

Variables ^a	Model A	Model A		Model B	
	F test (df)	P value	F test (df)	P value	
Number of systems in daily use	3.61 (1)	.06	0.56 (1)	.46	
Experience of using EHRs ^b	15.32 (1)	<.001	15.54 (1)	<.001	
Participation in IS ^c development	0.11 (1)	.75	0.00(1)	.99	
Perceived benefits	d	_	3.74 (1)	.05	
Technical problems	_	_	21.05 (1)	<.001	
Feedback	_	_	0.41 (1)	.52	
User friendliness	_	_	6.77 (1)	.01	
R^2	0.018 (1)	_	0.028 (1)	_	

^aAll analyses were adjusted for gender, age, employment sector, specialization status, and the electronic health record in use.

Discussion

Principal Findings

This study found that high levels of technical problems and high number of systems in daily use were associated with high levels of IS-related stress, whereas high levels of user-friendliness, perceived benefits, and support for feedback were associated with lower levels of this stress. SRIS levels were also lower for those who considered themselves as experienced users of EHRs. Moreover, we found that IS-related variables were also associated with physicians' well-being. More specifically, we found that high levels of technical problems were associated with high levels of psychological distress, whereas high levels of user-friendliness were associated with low distress levels. Those who considered themselves as experienced users of EHRs had lower levels of distress.



^bEHRs: electronic health records.

^cIS: information systems.

^dNot applicable.

^bEHRs: electronic health records.

^cIS: information systems.

^dNot applicable.

Limitations

This study relied on self-reported measures, which may lead to problems associated with an inflation of the strengths of relationships and with common method variance. To minimize problems with self-reports, we used measures that showed good reliability and have been used in previous studies. Moreover, although we controlled for many factors—such as age, gender, employment sector, specialization status, and the EHR system in use—we cannot rule out the possibility of residual confounding. Finland is among the forerunners in the digitalization of health care [30], and tax-financed universal health care is provided for all residents; therefore, generalizing our findings to countries with other types of health care systems or IT systems should be done with caution. However, digitalization is increasing at a high pace in developed countries, and previous studies showed that IS cause stress to physicians, and all physicians have to face new challenges coming from IS

The total number of respondents in the survey was rather large, about 4000. However, the response rate remained relatively low (21.92%; 4018/18,326), thus the generalizability of the findings to all physicians should be done with caution. The questionnaire was sent only electronically to physicians' emails; thus, it was not possible to answer by paper, which may have affected the response rate. Moreover, the survey was targeted to all physicians in clinical work, but the Finnish Medical Association's membership register did not allow us to select only physicians in clinical work as the target population. Therefore, the questionnaire was sent to all working-aged physicians with a cover letter calling for responses from physicians in clinical work. However, comparison with the target population showed good representativeness of the sample [18].

We found that IS-related variables were associated with stress levels and even well-being. However, according to our findings, it is not possible to clearly indicate whether the use of too many poorly functioning IS has extreme consequences and seriously impairs physicians' working life. Thus, it is difficult to define the clinical meaning of our findings. Future studies are needed in this regard.

Comparison With Previous Results

Our findings are congruent with previous findings showing that problems with IS may have negative ramifications for the well-being of physicians. For example, problems with IS have been associated with physicians' higher likelihood of burnout [31]. Poor EHR usability, time-consuming data entry, interference with face-to-face patient care, inefficient and less fulfilling work content, an inability to exchange health information between EHR products, and the degradation of clinical documentation have all been associated with physicians' professional dissatisfaction [5]. Moreover, technical problems in EHRs have been related to more experiences of time pressure and fewer possibilities to control one's job [14]. Previous studies have also shown that physicians' stress emerging from IS is related to cognitive workload, problems in teamwork, job dissatisfaction, and time pressures at work [1,15]. Moreover,

IS have been associated with job dissatisfaction and intent to leave [4].

Technical problems appeared as the most important IS-related risk factor for both SRIS and psychological distress in our study. In addition, previous studies have shown the importance of the technical quality of the IS among physicians. For example, it has been shown that the technical characteristics of the IS, such as the reliability, response time, and functionality, emerged as the most important factor associated with user satisfaction [32]. Moreover, technical problems have been related to more experiences of time pressure and fewer possibilities to control one's job [14]. Technical problems have also been found as an important barrier to the uptake of a computerized decision-support system [33]. Moreover, technical problems have also previously been found to be one of the most important challenges for patients when using mobile intervention tools [34] and Web-based intervention tools [35]. Of the technical problems, system instability in particular has been a primary concern in previous studies [6,7]. The importance of technical problems is not a surprise given that system errors, instability, missing information, low speed, and unexpected reactions may seriously challenge the workflow, waste time, hinder the doctor-patient relationship, and cause danger to patient safety.

Experience in using EHRs seemed to be an important factor in our study. Years of experience in using laboratory IS have previously been associated with usability ratings [36]. Experience is important given that systems change often, and physicians have to learn to master the new systems and are required to constantly develop their skills. In Finland, it has been found that learning to use an EHR requires a lot of training, and the time needed for this learning has increased between the years 2010 and 2014. EHRs may be challenging to use because of the multiplicity of screens, options, and navigational aids [37]. The complexity and usability problem associated with EHRs demands that physicians allocate time and effort to mastering them. However, the demands and pressures of care may not afford them this time [38]. Physicians may also see being forced to learn how to use the EHR system effectively and efficiently as a burden.

SRIS was higher among those physicians who had a higher number of systems in daily use. This corresponds well with previous findings showing that the multiple sign-ins required for multiple systems and the use of several systems simultaneously caused stress among health care professionals; in addition, the need to use multiple views was perceived as disruptive [39]. It has also been found that using several clinical systems on a daily basis led to the experience of time pressure and lessened job control [14]. We found that approximately 40% (39.56%, 1555/3930) of our respondents used 3 or more clinical systems on a daily basis. These physicians might be a group at high risk of stress. Thus, decreasing the number of systems a physician needs to log in to could have a big effect on physicians' work-related stress levels. If it is not possible to decrease the number of systems in daily use, it might be useful to identify these physicians and offer them support or provide them with compensation for their efforts (such as extra time off).



In our study, participation in IS-related development work did not have an effect on SRIS or distress levels. Half of the participants had participated in development work, which can be considered as a big proportion. A previous study suggested that participation in development work may cause time pressure but gives an important perception of having opportunities to control one's job [14]. It has been suggested that physicians should be included more in the development of their IS [1,15]. Moreover, it has been shown that physicians are interested in participating in IS development [16] and physician-driven improvements to EHR systems have been found to be useful [40]. An alternative approach to physicians' participation in development work is to question why physicians should invest their time and be involved in developing the IS when their education is totally focused on another subject. On the contrary, perhaps IT professionals should invest more time and effort in understanding the needs of physicians, for example, by using robust heuristic methods and dedicated resources.

Conclusions

We found that the usability of the IS, the number of systems in daily use, and one's experience as a user are associated with how stressful a physician perceives the IS to be and, furthermore, to a smaller extent, associated with the physician's well-being. According to our results, it seems that by investing in user-friendly systems with better technical quality and good support for feedback that professionals perceive as being of benefit would improve the work-related well-being and overall well-being of physicians. In particular, preventing technical problems seems to be very important.

Organizations should pay much more attention to the usability of their systems. By offering easy-to-use systems without technical problems, organizations could promote the work of physicians and release time for patient work. Good systems support workflow instead of hindering it. Improving the stability of the IS, a single sign-on, better documentation and retrieval of patient data, a peaceful documentation environment, and better access to patient data from other organizations have all been suggested as tools for promoting the IS-related well-being of health care professionals [39]. However, it seems that the needs of documenting and billing are prioritized when designing the IS instead of focusing on the needs of doctors and patients [11]. Moreover, IT professionals and hospital administrators may have a stronger voice compared with end users in decisions about the IS because they are perceived more clearly by vendors as the buyers of their systems and given higher priority [41].

Moreover, organizations would benefit from offering training opportunities to physicians and minimizing the number of their systems in daily use. However, uncertainty seems to exist about whose responsibility this training would be [39], and it would be beneficial if organizations had some kind of strategy for improving their professionals' electronic skills. Time has been shown to be of great importance in relation to IS use [1,15]. Physicians also need some sort of support when they face IS-related problems. For instance, clerical support personnel have been found to lessen stress and fatigue after implementing new systems [42].

Acknowledgments

This study was supported by the Finnish Work Environment Fund (project 116104), the Strategic Research Council at the Academy of Finland (projects 303607 and 327145), and the Ministry of Social Affairs and Health (project 112241). The authors wish to thank all the physicians that responded to the questionnaires.

Conflicts of Interest

None declared.

Multimedia Appendix 1

Measures used in the study.

[PDF File (Adobe PDF File), 365 KB-Multimedia Appendix 1]

References

- 1. Heponiemi T, Hyppönen H, Vehko T, Kujala S, Aalto A, Vänskä J, et al. Finnish physicians' stress related to information systems keeps increasing: a longitudinal three-wave survey study. BMC Med Inform Decis Mak 2017 Oct 17;17(1):147 [FREE Full text] [doi: 10.1186/s12911-017-0545-y] [Medline: 29041971]
- 2. Shanafelt TD, Dyrbye LN, Sinsky C, Hasan O, Satele D, Sloan J, et al. Relationship between clerical burden and characteristics of the electronic environment with physician burnout and professional satisfaction. Mayo Clin Proc 2016 Jul;91(7):836-848. [doi: 10.1016/j.mayocp.2016.05.007] [Medline: 27313121]
- 3. Vänskä J, Viitanen J, Hyppönen H, Elovainio M, Winblad I, Reponen J. Doctors critical of electronic patient record systems. Finn Med J 2010;50-52:4177-4183.
- 4. Babbott S, Manwell LB, Brown R, Montague E, Williams E, Schwartz M, et al. Electronic medical records and physician stress in primary care: results from the MEMO Study. J Am Med Inform Assoc 2014 Feb;21(e1):e100-e106 [FREE Full text] [doi: 10.1136/amiajnl-2013-001875] [Medline: 24005796]
- 5. Friedberg M, Chen P, Van Busum KR, Aunon F, Pham C, Caloyeras J. Factors Affecting Physician Professional Satisfaction and Their Implications for Patient Care. Washington, DC: Rand offices; 2013.



- 6. Kaipio J, Lääveri T, Hyppönen H, Vainiomäki S, Reponen J, Kushniruk A, et al. Usability problems do not heal by themselves: national survey on physicians' experiences with EHRs in Finland. Int J Med Inform 2017 Jan;97:266-281 [FREE Full text] [doi: 10.1016/j.ijmedinf.2016.10.010] [Medline: 27919385]
- 7. Viitanen J, Hyppönen H, Lääveri T, Vänskä J, Reponen J, Winblad I. National questionnaire study on clinical ICT systems proofs: physicians suffer from poor usability. Int J Med Inform 2011 Oct;80(10):708-725. [doi: 10.1016/j.ijmedinf.2011.06.010] [Medline: 21784701]
- 8. Kroth PJ, Morioka-Douglas N, Veres S, Babbott S, Poplau S, Qeadan F, et al. Association of electronic health record design and use factors with clinician stress and burnout. JAMA Netw Open 2019 Aug 2;2(8):e199609 [FREE Full text] [doi: 10.1001/jamanetworkopen.2019.9609] [Medline: 31418810]
- 9. Hellström L, Waern K, Montelius E, Astrand B, Rydberg T, Petersson G. Physicians' attitudes towards ePrescribing--evaluation of a Swedish full-scale implementation. BMC Med Inform Decis Mak 2009 Aug 7;9:37 [FREE Full text] [doi: 10.1186/1472-6947-9-37] [Medline: 19664219]
- 10. Bouamrane M, Mair FS. A study of general practitioners' perspectives on electronic medical records systems in NHSScotland. BMC Med Inform Decis Mak 2013 May 21;13:58 [FREE Full text] [doi: 10.1186/1472-6947-13-58] [Medline: 23688255]
- 11. O'Malley AS, Grossman JM, Cohen GR, Kemper NM, Pham HH. Are electronic medical records helpful for care coordination? Experiences of physician practices. J Gen Intern Med 2010 Mar;25(3):177-185 [FREE Full text] [doi: 10.1007/s11606-009-1195-2] [Medline: 20033621]
- 12. Edwards PJ, Moloney KP, Jacko JA, Sainfort F. Evaluating usability of a commercial electronic health record: a case study. Int J Hum-Comp Stud 2008 Oct;66(10):718-728. [doi: 10.1016/j.ijhcs.2008.06.002]
- 13. Kjeldskov J, Skov MB, Stage J. A longitudinal study of usability in health care: does time heal? Int J Med Inform 2010 Jun;79(6):e135-e143. [doi: 10.1016/j.ijmedinf.2008.07.008] [Medline: 18757234]
- 14. Vainiomäki S, Aalto A, Lääveri T, Sinervo T, Elovainio M, Mäntyselkä P, et al. Better usability and technical stability of EPRs could lead to better work-related well-being among physicians. Appl Clin Inform 2017 Oct;8(4):1057-1067 [FREE Full text] [doi: 10.4338/ACI-2017-06-RA-0094] [Medline: 29241245]
- 15. Heponiemi T, Hyppönen H, Kujala S, Aalto A, Vehko T, Vänskä J, et al. Predictors of physicians' stress related to information systems: a nine-year follow-up survey study. BMC Health Serv Res 2018 Apr 13;18(1):284 [FREE Full text] [doi: 10.1186/s12913-018-3094-x] [Medline: 29653530]
- 16. Martikainen S, Viitanen J, Korpela M, Lääveri T. Physicians' experiences of participation in healthcare IT development in Finland: willing but not able. Int J Med Inform 2012 Feb;81(2):98-113. [doi: 10.1016/j.ijmedinf.2011.08.014] [Medline: 21956004]
- 17. Hyppönen H, Lumme S, Reponen J, Vänskä J, Kaipio J, Heponiemi T, et al. Health information exchange in Finland: usage of different access types and predictors of paper use. Int J Med Inform 2019 Feb;122:1-6. [doi: 10.1016/j.ijmedinf.2018.11.005] [Medline: 30623778]
- 18. Saastamoinen A, Hyppönen H, Kaipio J, Lääveri T, Reponen J, Vainiomaki S, et al. Lääkärien arviot potilastietojärjestelmistä ovat parantuneet hieman [Doctors' assessments of patient information systems have improved slightly]. Finn Med J 2018;73(34):1814-1819 [FREE Full text]
- 19. Hyppönen H, Hämäläinen P, Reponen J. e-health and e-Welfare of Finland: check point 2015. In: National Institute for Health and Welfare (THL) Report 18/2015. Finland: National Institute for Health and Welfare; 2015.
- 20. Heponiemi T, Aalto A, Pekkarinen L, Siuvatti E, Elovainio M. Are there high-risk groups among physicians that are more vulnerable to on-call work? Am J Emerg Med 2015 May;33(5):614-619. [doi: 10.1016/j.ajem.2015.01.034] [Medline: 25680563]
- 21. Kuusio H, Heponiemi T, Aalto A, Sinervo T, Elovainio M. Differences in well-being between GPs, medical specialists, and private physicians: the role of psychosocial factors. Health Serv Res 2012 Feb;47(1 Pt 1):68-85 [FREE Full text] [doi: 10.1111/j.1475-6773.2011.01313.x] [Medline: 22091688]
- 22. Reponen J, Kangas M, Hämäläinen P, Keränen N, Haverinen J. Use of information and communications technology in Finnish health care in 2017. Current situation and trends. Terveyden ja hyvinvoinnin laitos (THL) National Institute for Health and Welfare (THL); Report 5/2018. Helsinki 2018:2018.
- 23. Hair J, Black W, Babin B, Anderson R, Tatham R. Multivariate Data Analysis. New Jersey: Pearson Educational Inc; 2006.
- 24. Goldberg D. The Detection of Psychiatric Illness by Questionnaire: A Technique for the Identification and Assessment of Non-psychotic Psychiatric Illness. Oxford, London: Oxford U Press; 1972.
- 25. Graetz B. Multidimensional properties of the General Health Questionnaire. Soc Psychiatry Psychiatr Epidemiol 1991 May;26(3):132-138. [doi: 10.1007/bf00782952] [Medline: 1887291]
- 26. Penninkilampi-Kerola V, Miettunen J, Ebeling H. A comparative assessment of the factor structures and psychometric properties of the GHQ-12 and the GHQ-20 based on data from a Finnish population-based sample. Scand J Psychol 2006 Oct;47(5):431-440. [doi: 10.1111/j.1467-9450.2006.00551.x] [Medline: 16987212]
- 27. Aalto A, Heponiemi T, Josefsson K, Arffman M, Elovainio M. Social relationships in physicians' work moderate relationship between workload and wellbeing-9-year follow-up study. Eur J Public Health 2018 Oct 1;28(5):798-804. [doi: 10.1093/eurpub/ckx232] [Medline: 29365062]



- 28. Heponiemi T, Aalto A, Puttonen S, Vänskä J, Elovainio M. Work-related stress, job resources, and well-being among psychiatrists and other medical specialists in Finland. Psychiatr Serv 2014 Jun 1;65(6):796-801. [doi: 10.1176/appi.ps.201300200] [Medline: 24585088]
- 29. Hyppönen H, Kaipio J, Heponiemi T, Lääveri T, Aalto A, Vänskä J, et al. Developing the national usability-focused health information system scale for physicians: validation study. J Med Internet Res 2019 May 16;21(5):e12875 [FREE Full text] [doi: 10.2196/12875] [Medline: 31099336]
- 30. Sabes-Figuera R, Maghiros I. European Commission. 2013. European Hospital Survey Benchmarking Deployment of eHealth services (2012-2013) URL: https://ec.europa.eu/digital-single-market/en/news/european-hospital-survey-benchmarking-deployment-ehealth-services-2012-2013 [accessed 2019-09-26]
- 31. Gardner RL, Cooper E, Haskell J, Harris DA, Poplau S, Kroth PJ, et al. Physician stress and burnout: the impact of health information technology. J Am Med Inform Assoc 2019 Feb 1;26(2):106-114. [doi: 10.1093/jamia/ocy145] [Medline: 30517663]
- 32. Kuo K, Liu C, Talley PC, Pan S. Strategic improvement for quality and satisfaction of hospital information systems. J Healthc Eng 2018;2018:3689618 [FREE Full text] [doi: 10.1155/2018/3689618] [Medline: 30298099]
- 33. Liberati EG, Ruggiero F, Galuppo L, Gorli M, González-Lorenzo M, Maraldi M, et al. What hinders the uptake of computerized decision support systems in hospitals? A qualitative study and framework for implementation. Implement Sci 2017 Sep 15;12(1):113 [FREE Full text] [doi: 10.1186/s13012-017-0644-2] [Medline: 28915822]
- 34. Amoakoh-Coleman M, Borgstein AB, Sondaal SF, Grobbee DE, Miltenburg AS, Verwijs M, et al. Effectiveness of mHealth interventions targeting health care workers to improve pregnancy outcomes in low- and middle-income countries: a systematic review. J Med Internet Res 2016 Aug 19;18(8):e226 [FREE Full text] [doi: 10.2196/jmir.5533] [Medline: 27543152]
- 35. Bruggeman-Everts FZ, Wolvers MD, van de Schoot R, Vollenbroek-Hutten MM, van der Lee ML. Effectiveness of two web-based interventions for chronic cancer-related fatigue compared to an active control condition: results of the "Fitter na kanker" randomized controlled trial. J Med Internet Res 2017 Oct 19;19(10):e336 [FREE Full text] [doi: 10.2196/jmir.7180] [Medline: 29051138]
- 36. Mathews A, Marc D. Usability evaluation of laboratory information systems. J Pathol Inform 2017;8:40 [FREE Full text] [doi: 10.4103/jpi.jpi 24 17] [Medline: 29114434]
- 37. Ludwick DA, Doucette J. Primary care physicians' experience with electronic medical records: barriers to implementation in a fee-for-service environment. Int J Telemed Appl 2009;2009:853524 [FREE Full text] [doi: 10.1155/2009/853524] [Medline: 19081787]
- 38. Simon SR, Kaushal R, Cleary PD, Jenter CA, Volk LA, Orav EJ, et al. Physicians and electronic health records: a statewide survey. Arch Intern Med 2007 Mar 12;167(5):507-512. [doi: 10.1001/archinte.167.5.507] [Medline: 17353500]
- 39. Vehko T, Hyppönen H, Ryhänen M, Tuukkanen J, Ketola E, Heponiemi T. Health information systems and wellbeing? health professionals? experiences. Fin J EHealth EWelfare 2018 Mar 8;10(1):143-163. [doi: 10.23996/fjhw.65387]
- 40. Guo U, Chen L, Mehta PH. Electronic health record innovations: helping physicians One less click at a time. Health Inf Manag 2017 Sep;46(3):140-144. [doi: 10.1177/1833358316689481] [Medline: 28671038]
- 41. Shaha JS, El-Othmani MM, Saleh JK, Bozic KJ, Wright J, Tokish JM, et al. The growing gap in electronic medical record satisfaction between clinicians and information technology professionals: issues of most concern and suggested remediations. J Bone Joint Surg Am 2015 Dec 2;97(23):1979-1984. [doi: 10.2106/JBJS.N.01118] [Medline: 26632000]
- 42. Contratto E, Romp K, Estrada CA, Agne A, Willett LL. Physician order entry clerical support improves physician satisfaction and productivity. South Med J 2017 May;110(5):363-368. [doi: 10.14423/SMJ.0000000000000645] [Medline: 28464179]

Abbreviations

EHR: electronic health record **GHQ:** General Health Questionnaire

IS: information systems**IT:** information technology

SRIS: stress related to information systems

Edited by G Eysenbach; submitted 23.01.19; peer-reviewed by D Marc, L Moja, KM Kuo; comments to author 01.05.19; revised version received 14.06.19; accepted 31.08.19; published 05.11.19

Please cite as:

Heponiemi T, Kujala S, Vainiomäki S, Vehko T, Lääveri T, Vänskä J, Ketola E, Puttonen S, Hyppönen H Usability Factors Associated With Physicians' Distress and Information System—Related Stress: Cross-Sectional Survey JMIR Med Inform 2019;7(4):e13466

URL: http://medinform.jmir.org/2019/4/e13466/

doi: <u>10.2196/13466</u> PMID: <u>31687938</u>



JMIR MEDICAL INFORMATICS

Heponiemi et al

©Tarja Heponiemi, Sari Kujala, Suvi Vainiomäki, Tuulikki Vehko, Tinja Lääveri, Jukka Vänskä, Eeva Ketola, Sampsa Puttonen, Hannele Hyppönen. Originally published in JMIR Medical Informatics (http://medinform.jmir.org), 05.11.2019. This is an open-access article distributed under the terms of the Creative Commons Attribution License (https://creativecommons.org/licenses/by/4.0/), which permits unrestricted use, distribution, and reproduction in any medium, provided the original work, first published in JMIR Medical Informatics, is properly cited. The complete bibliographic information, a link to the original publication on http://medinform.jmir.org/, as well as this copyright and license information must be included.

