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Exploring Technostress: Results of a Large Sample Factor Analysis

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Abstract

With reference to the results of a large sample factor analysis, the article aims to propose the frame examining technostress in a population. The survey and principal component analysis of the sample consisting of 1013 individuals who use ICT in their everyday work was implemented in the research. 13 factors combine 68 questions and explain 59.13 per cent of the answers dispersion. Based on the factor analysis, questionnaire was reframed and prepared to reasonably analyze the respondents' answers, revealing technostress causes and consequences as well as technostress prevalence in the population in a statistically validated pattern. A key elements of technostress based on factor analysis can serve for the construction of technostress measurement scales in further research.

Keywords: ICT impact on employees, Assessment of Technostress; Human Resource Management; Factor analysis.

1. Introduction

The term "technostress" was proposed by a psychologist Craig Brod in 1984 [5]. The author described technostress as a health disorder of nowadays, arising from an individual's inability to rationally adapt to the environment filled with technologies [5]. Later on, technostress became an interdisciplinary field of research which is of interest to organization's theorists, scientists of management, psychology, information and technology management and various other fields. Many works are worth mentioning that explore the factors inducing stress and symptoms of technostress [2], [4], [35], [36], [1], [22], [40], [25], [26], confirm that technostress negatively affects efficiency and work satisfaction [35], [27], [42], [3], [38], analyze personal characteristics influence on the intensity of technostress [42], [8], reveal the symptoms of technostress and individual's reaction to technostress [28], [7], [37], [17], [27], [38], [34], [36], [9], [32], [6]; [15], [21], [16], [18], discuss impact of the leadership to the technostress [12]. Therefore, the research concentrate on several

fields: i) definition of technostress as a phenomenon; ii) examination of factors causing technostress (stressors); iii) research of technostress factor interactions and technostress effect in different populations. In spite of increasing number of technostress research, empirical measurements of technostress causes and consequences remain a field that lacks studying. In addition, even less authors are interested in the validation of technostress measurement questionnaire and creation of technostress evaluation instrument. Hence, our article is aiming to start filling this gap.

The penetration of information, communication and mobile technologies is extremely intense in Lithuanian organizations. The possibility to reach employees at home is especially favorable, because as much as 70 per cent of inhabitants in Lithuania have computers and access to the internet at home [19]. Therefore, it is purposeful and important to investigate the prevalence of technostress and its effect amongst the organization's employees. In order for the research results to be reliable, it should firstly be ensured that the research will invoke methodology which allows to reasonably forming the generalizations of the gathered data. This necessity gives origin to the purpose of the article - to identify the key factors causing technostress in a particular population. With reference to the results of a large sample factor analysis, the future research (both in practice and for scientific purposes) will be able to reasonably analyze the prevalence of technostress in a population and its effect on employees of different genders, age and marital status in Lithuania. Furthermore, our research enables the comparison of results with the results published by Tarafdar et al. [35], [36] and Fuglseth and Sorebo [13], and form conclusions verified in an intercultural context, which increases the scientific value of our research.

The limitations of the research are related to the characteristics of the investigated population and the factor analysis method. Theoretically, a possible outcome of a research conducted on another sample or in another population, the questions would be answered by representatives with very different characteristics than the ones we've questioned. Due to this reason, the number and significance of the factors could differ. However, it is unlikely, because during our survey, a rather big and heterogeneous sample was questioned.

2. Technostress assessment issues

Hudiburg [14] and Rosen and Weill [30] were among the first authors who have methodologically researched technostress measurement capabilities.

Hudiburg [14] created The Computer Technology Hassles Scales and distinguished two subscales: Computer Runtime Problems and Computer Information Problems. These scales allowed to measure computer stressors. As it is seen from recent publications in the technostress field, some factors mentioned in the Hudiburg scales are still relevant nowadays (e.g. increased computer expectations, increased time demands, necessity to update skills) while others (from the subscale Computer Runtime Problems) are outdated.

The technostress measurement instrumentation proposed by Rosen and Weill [30] is used to measure people's anxiety, cognition and attitudes towards computers. The instrumentation consists of three scales: the Computer Anxiety Rating Scale (CARS-C), Computer Thought Survey Scale (CTS-C) and the General Attitudes towards Computer Scale (GATCS-C). With the help of these scales, Rosen and Weill [30] determined that 39 per cent of the population suffers from average or high level technostress (the researches were conducted in the Education sector). However, in the year 2012, using the same scales, Self and Aquilina [31] found that average and high technostress is experienced by 56 per cent of the population. It is obvious that technostress is becoming an increasingly relevant problem for a major part of the society.

The majority of modern technostress research is based on a technostress cause structure proposed by Tarafdar et al. [35], which consists of such components as techno-overload, techno-invasion, techno-complexity, techno-insecurity and techno-uncertainty. Regarding the transaction theory, some authors incorporate this structure into a wider model of research for technostress assumptions, causes and consequences [13], whereas others investigate only several components [41], [21].

It is most likely that the study of Fuglseth and Sorebo [13] best reflects the context of striving for the methodological reliability of technostress evaluation instrument. Authors [13] analyze the components of technostress with the help of factor analysis and a tool Mplus 6.1. The authors examine "Technostress creators", influencing "employee satisfaction with ICT use", as well as "Technostress inhibitors" (technical support provision, literacy facilitation, involvement facilitation), which directly affect not only the "employee satisfaction with ICT use", but also "employee intension to extend the use of ICT".

Other authors rarely seek to verify the content of components itself. However, some of them see a necessity to do so. For example, Yin et al. [41] creates a technostress evaluation model based on a few components distinguished by Tarafdar et al. [35]. The authors examines the effect of techno-overload and techno-insecurity to individual's job satisfaction and offer to supplement the model with external circumstances and individual's habits. The authors ground their model with a sample of 30 postgraduate students, and are planning to revise the measurement used in the following large-scale data collection process with the working professionals who use mobile, information and communication technologies in their work [41]. The authors are preparing to conduct a validation of research instrumentation.

On the other hand, the very components of technostress defined by Tarafdar et al. [35] may be discussed. For example, Hung at al. [15] investigates technooverload effect to employees, but states that the negative effect is evoked not by the techno-overload, but rather communication-overload. This factor was not defined earlier. On the other hand, even Kupersmith [20] noticed that overcoming "information overload" is a real problem. Therefore, research of technostress factors does not lose their significance. As the validation of technostress assessment tool is not well explored in publications yet, it is a relevant field of research. As the time changes, technological literacy of individuals changes along with the attitude to technologies in general. Thus, it is necessary to periodically investigate the content and dynamics of technostress factors.

3. Research methodology

Our research aims to identify key factors and their defining variables that determine technostress in a particular population.

The survey was conducted in two stages.

At the first stage, based on the analysis of scientific publications on the technostress, a questionnaire for evaluating the variables determining technostress was formed. Based on Tarafdar et al. [35], our survey was composed of eight segments: 1. ICT in the organization. Questions were given to find out the nature of ICT change in organizations and the importance of ICT for organizing the employees' work and collaboration; 2. Properties of job assignment organization and accomplishment. The questions in this segment were meant to ascertain how intensively is ICT used by employees' while performing their tasks; 3. ICT and personal time. Questions were formed that allowed to evaluate the employees' personal and work balance; 5. Dependency on ICT. The questions were given with a goal to identify if the organizations' employees have a choice of work tools and opportunity to decide whether to accomplish the daily work assignments with or without using ICT; 6. ICT and self-consciousness. In this segment, individuals were asked to describe their physical and psychological health state and typical behavior that, according to the respondents, is related with the use of ICT to accomplish daily assignments; 7. Satisfaction in work and personal life. These questions were used to find out how respondents evaluate their work and personal life quality, health condition, resources of inner energy; 8. Socio-demographic data. Respondents were asked to identify their age, gender, education, branch of activity of their represented organization etc.

The survey participants were offered a closed type questionnaire and asked to express their opinion by five-point Likert scale choosing between strongly agree, agree, neither agree nor disagree, disagree and strongly disagree, where the answer "Strongly agree" was evaluated by 5 points and "Strongly disagree" was evaluated by 1 point.

To verify the reliability of the questionnaire, Cronbach's alpha coefficient was invoked, which is used to verify that all questions of the questionnaire scale correlate with each other.

A survey population is based on the premise that every employee could use ICT for work purposes. On this premise, survey population composed of approximately 1,61 million individuals [24]. According to simple random sampling methodology a representative population should consist of a minimum of 384 respondents (for 95% reliability and 5% error). An inquiry of 71 questions was spread in the population with the help of a public opinion poll web-page. An invitation to participate in the survey was also distributed in social networks (Facebook, LinkedIn) and with chain e-mails.

| 1013 properly | completed | questionnaires | were | received. | Table | 1 | presents | the |
|-------------------|--------------|-------------------|------|-----------|-------|---|----------|-----|
| socio-demographic | data of surv | vey representativ | ves. | | | | | |

| | | Frequency | Percent | Cumulative % |
|--------------|---------------------------|-----------|------------|--------------|
| Gender | Male | 290 | 28.6 | 28.6 |
| Gender | Female | 723 | 71.4 | 100.0 |
| Аде | < 20 | 6 | 6 | 6 |
| ngc - | 20 - 29 | 503 | ,0 49 7 | 50.2 |
| | $\frac{20-29}{30-39}$ | 279 | 27.5 | 77.8 |
| | $\frac{30-39}{40-49}$ | 144 | 14.2 | 92.0 |
| | 50 - 59 | 73 | 7 2 | 99.2 |
| | 60 - 69 | 7 | 7 | 99.9 |
| | 70+ | 1 | 1 | 100.0 |
| Children | 0 | 598 | 59.0 | 59.0 |
| | 1 | 200 | 19.7 | 78.8 |
| | 2 | 162 | 16.0 | 94.8 |
| | 3 | 46 | 4.5 | 99.3 |
| | 4 | 4 | .4 | 99.7 |
| | 5 | 2 | .2 | 99.9 |
| | 8 | 1 | .1 | 100.0 |
| Represented | Individual business owner | 44 | 4,3 | 4.3 |
| sector | Production | 89 | 8,8 | 13,1 |
| | Services and Facilities | 514 | 50,7 | 63,9 |
| | Commerce | 73 | 7,2 | 71,1 |
| | Education | 142 | 14,0 | 85,1 |
| | Public Administration | 124 | 12,2 | 97,3 |
| | Other | 27 | 2,7 | 100,0 |
| Role at | Head | 140 | 13,8 | 13,8 |
| organization | Professional | 480 | 47,4 | 61,2 |
| | Administration staff | 215 | 21,2 | 82,4 |
| | Operation staff | 161 | 15,9 | 98,3 |
| | Other | 17 | 1,7 | 100,0 |

Table 1. Socio-demographic data of survey representatives.

At the second stage, the factor analysis was conducted on the basis of the data gathered during the research, which allowed to distinguishing groups in the array of questions-variables, called factors. One such factor includes variables strongly correlating with each other, but weakly correlating with other variables. This way,

every factor depicts the empirical connections between the variables. Factors insure significance to every variable, which may be used in connecting variables into integrated indexes. The number of factors is determined with *Kaiser* Eigenvalues rule as well as *Cattel scree* criterion. Hence, with the help of factor analysis, the factors causing technostress and their values were determined.

The data of the survey was processed using a program IBM SPSS Statistics.

4. Research results

Factor analysis enables distinguishing a series of groups in the array of variables, called components or factors. The grouping is done by calculating the correlation between variables. One component includes variables that strongly correlate with each other, but weakly correlate or do not correlate with other variables, which form other components.

Using methods of factor analysis, two types of objectives – exploratory and confirmatory - could be pursued. Based on the objective, the factor analysis is called exploratory factor analysis (EFA) and confirmatory factor analysis (CFA).

Exploratory factor analysis is applied when an array of variables is present and the number of components is unknown as well as what variables form them and if the variables are linearly related (collinear) in general.

In order for the data to be appropriate for factor analysis, they should correlate, e.g. be related with each other. Whether the variables are related with each other may be decided from the initial correlation matrix. The sampling adequacy for factor analysis is verified with using of Kaiser-Meyer-Olkin (KMO) measure and Bartlett's test of sphericity. These two methods conclude a minimal standard, mandatory before conducting factorial or principal component analysis.

KMO measure verifies if the partial correlation coefficients of the variables are low. If the value of KMO measure is low, the factor analysis of the explored variables is non-resulted. In such case, low value of KMO statistics shows that the correlation between pairs of variables is not explained through other variables. The KMO statistic varies between 0 and 1. A value close to 1 indicates that patterns of correlations are relatively compact and so factor analysis should yield distinct and reliable factors. Field [11] claims that KMO measures lower than 0,5 are unacceptable. If KMO < 0,5, it is necessary to increase the sample or refuse a part of problem variables. The meanings of KMO values should be treated as follows: barely acceptable (bellow 0,5), mediocre (between 0,5 and 0,7), good (between 0,7 and 0,8), great (between 0,8 and 0,9) and superb (above 0,9).

It is also mandatory to verify whether there are statistically significantly correlating variable pairs observed at all [11]. This is shown by the Bartlett's test of sphericity. This test verifies null hypothesis which states that the variables of the population's correlation matrix are non-correlated, i.e. the correlation matrix is singular and the elements of its diagonal are equal to one and the rest are equal to zero (which means that the variables are no correlated). Factor analysis has no meaning when the p-value of this statistics is higher or equal than the selected significance level.

A principal component analysis (PCA) of the research data presented in this article was conducted on the 71 items with orthogonal rotation (Varimax). The Kaiser–Meyer–Olkin measure verified the sampling adequacy for the analysis, a KMO value of 0,932 was obtained. This shows that the *sample adequacy for explored factor analysis is superb* (Table 2).

The analysis has also shown that the Bartlett's test of sphericity χ^2 (2485) = 34447,027, p< ,001 and is lower than the selected level of significance with a reliability of 95% and 99% (Table 2). Hence, a conclusion is made that *the data are adequate to conduct a factor analysis*.

| кмо | and | Bartlett's | Test |
|-----|-----|------------|------|
|-----|-----|------------|------|

| Kaiser-Meyer-Olkin Measure of | ,932 | |
|-------------------------------|--------------------|-----------|
| Bartlett's Test of Sphericity | Approx. Chi-Square | 34447,027 |
| | Df | 2485 |
| | Sig. | ,000 |

Table 2. Survey data adequacy for factor analysis.

During our conducted factor analysis, 71 total components were distinguished. Therefore, the whole dispersion may be obtained through 71 rates (Table 3).

Table 3 lists the eigenvalues associated with each component (factor) before extraction, after extraction and after rotation and shows the dispersion of each evaluated component. The eigenvalues associated with each factor represent the variance explained by that particular component (in column Total). The column Percent of Variance concludes the whole dispersion in percent values. The eigenvalue of the first factor is 15,535. As this value is higher than 1,0, it means that the factor explains 15,535 times more dispersion than a separate variable. In percent values, the first factor explains 15,535/71 = 0,21881 or 21.881% dispersion. If the eigenvalue of a factor is less than 1, it explains less dispersion than a separate variable. In order to decide what number of factors should be retained, Kaiser's criterion was invoked. Kaiser's criterion is suggested to be used for investigation of factors the eigenvalues of which are higher or equal to 1. In our case, the number of such factors is 14.

After reducing the number of factors to 14, 60,605% of the initial data dispersion left. Field [11] states that the constituted factor model is applicable if no less of 50% of the initial variable dispersion remains. Hence, we may strongly claim that our factor model is appropriate.

The significance of the variable factor loading depends on the size of the sample. In case of sample size is 100, loadings higher than 0,512 are considered significant, while when a sample size is 1000, a factor must be higher than 0,162 to be held significant [33]. However, the most authors adhere to a more conservative treatment and state that a factor loading is significant when its absolute value is no less than 0,4. Thus, variables with factor loading less than 0,4 were removed. In addition, Rotated Component Matrix has shown that the 14th factor is only determined by one variable with a loading greater than 0,4. Therefore, we shall eliminate this factor.

Summing it up, we finally keep 13 factors the Kaiser's criterion eigenvalues of which are up 1 and which explain 59,130% of the initial data dispersion (Table 3).

Total Variance Explained

| | | | Extra | traction Sums of | | Rotation Sums of | | | |
|-----------|--------|---------------|--------------|------------------|---------------|------------------|-------|---------------|--------------|
| | Initia | al Eigenva | lues | Squa | red Load | lings | Squ | ared Loa | dings |
| Component | Total | % of Variance | Cumulative % | Total | % of Variance | Cumulative % | Total | % of Variance | Cumulative % |
| 1 | 15,535 | 21,881 | 21,881 | 15,535 | 21,881 | 21,881 | 6,595 | 9,289 | 9,289 |
| 2 | 5,461 | 7,692 | 29,572 | 5,461 | 7,692 | 29,572 | 6,472 | 9,116 | 18,405 |
| 3 | 3,154 | 4,442 | 34,015 | 3,154 | 4,442 | 34,015 | 4,788 | 6,743 | 25,149 |
| 4 | 2,783 | 3,920 | 37,935 | 2,783 | 3,920 | 37,935 | 3,303 | 4,653 | 29,801 |
| 5 | 2,704 | 3,809 | 41,743 | 2,704 | 3,809 | 41,743 | 3,056 | 4,305 | 34,106 |
| 6 | 2,195 | 3,092 | 44,835 | 2,195 | 3,092 | 44,835 | 2,985 | 4,205 | 38,311 |
| 7 | 1,901 | 2,677 | 47,512 | 1,901 | 2,677 | 47,512 | 2,840 | 4,000 | 42,311 |
| 8 | 1,715 | 2,416 | 49,928 | 1,715 | 2,416 | 49,928 | 2,599 | 3,660 | 45,971 |
| 9 | 1,514 | 2,132 | 52,060 | 1,514 | 2,132 | 52,060 | 2,470 | 3,479 | 49,450 |
| 10 | 1,446 | 2,037 | 54,098 | 1,446 | 2,037 | 54,098 | 2,171 | 3,058 | 52,508 |
| 11 | 1,295 | 1,825 | 55,922 | 1,295 | 1,825 | 55,922 | 1,505 | 2,120 | 54,628 |
| 12 | 1,164 | 1,639 | 57,561 | 1,164 | 1,639 | 57,561 | 1,482 | 2,088 | 56,715 |
| 13 | 1,114 | 1,569 | 59,130 | 1,114 | 1,569 | 59,130 | 1,424 | 2,005 | 58,721 |
| 14 | 1,047 | 1,475 | 60,605 | 1,047 | 1,475 | 60,605 | 1,338 | 1,884 | 60,605 |
| 15 | ,990 | 1,395 | 62,000 | | | | | | |
| 16 | ,941 | 1,326 | 63,325 | | | | | | |
| | | | | | | | | | |
| 70 | ,197 | ,277 | 99,742 | | | | | | |
| 71 | ,183 | ,258 | 100,00 0 | | | | | | |

Table 3. Principal Component Analysis.

The questionnaire scale internal consistency was evaluated using Cronbach's alpha coefficient, which evaluates whether all questions of the scale adequately reflect the investigated value and allow to specify the number of questions required in the scale. If the sum of dispersion of different questions is close to the dispersion of the whole scale, separate questions do not correlate with each other, i.e. they do not reflect the same thing. In this case, the questionnaire scale consists of random questions and Cronbach's alpha coefficient is close to zero. If the dispersion of the whole questionnaire scale is significantly higher than the sum of all questions dispersion, separate questions correlate with each other, i.e. reflect the same thing. In this case, Cronbach's alpha coefficient is close to one. Cronbach's alpha coefficient should be interpreted carefully, because its value depends not only on the strength of correlation between variables but also on the number of variables in a factor [23]. Various authors give different sizes of a coefficient for the scale to be reliable. The most mentioned minimal value of Cronbach's alpha is 0,7 [39]. If the scale is only used for a statistical analysis (as in our particular case), the authors suggest that Cronbach's alpha may be lower than 0,7, but it should nonetheless be around 0,5. However, if the constructs are of psychological nature, even lower values could be acceptable [11]. It is plausible that lower values of this statistics can be influenced by a lower number of variables in a factor. In table 4, low values of Cronbach's alpha are exactly related with a low number of variables. In our case, the Cronbach's alpha values of technostress factor scale fluctuate from 0,554 to 0,915 (Table 4). It can be stated that the internal consistency of technostress factor scales varies from average to very good.

The internal consistency of the scales is precisely evaluated by conducting a confirmatory factor analysis and calculating the average explained dispersion [10]. Nevertheless, the final validation of the scales is not an assignment of this research.

| | L | % | α |
|---|---------|--------|-------|
| F1. The influence of leadership and job management on a | ee comm | itment | |
| I think that I should find a work with lesser work load and | 770 | | |
| more honest work load accounting | ,770 | | |
| I care less about the organization's results and success | ,737 | | |
| I think that I work a lot more than I am evaluated in terms | 724 | | |
| of salary | ,/34 | | |
| I wish my leaders would "enjoy" my emotional state as | ,720 | 21,881 | 0,915 |
| mine when accomplishing their commitments | | | |
| I am starting to feel being exploited by the organization | ,698 | | |
| It begins to seem that some co-workers work a lot less than | (77 | | |
| me | ,0// | | |
| I got irritated at my leaders who cannot regulate the work | 666 | | |
| load effectively | ,000 | | |
| I have to time to worry about my random mistakes in my | 507 | | |
| work | ,597 | | |

| I think that I sacrifice too much of my personal time for | .583 | | |
|---|---|-------|-------|
| the work | , | | |
| I feel that inspiration and initiative comes increasingly | ,580 | | |
| rarer in my work | | | |
| I have to be extremely concentrated in order to reduce the | ,492 | | |
| lateness of work accomplishment to a minimum | | | |
| F2. The effect of work intensity to psycho-emotional state |) | 1 | |
| After work day, I am annoyed by my family requiring my attention | ,756 | | |
| After work day. I have no energy to take on "household" | | | |
| activities | ,720 | | |
| After work day, I feel exhausted from communication and | 710 | | |
| do not want to speak with anyone | ,/19 | | |
| After work day, I have less desire to meet my friends | ,708 | | |
| I am annoved by having household commitments after an | 704 | | |
| intensive day at work | ,704 | | |
| After work day, I get irritated from noise, e.g. TV, radio, | (07 | 7,692 | 0,912 |
| household chore sounds, noise of children or neighbours | ,685 | - | - |
| I begin to make mistakes in work assignments | ,628 | 1 | |
| More and more often I feel irritated and nervous | ,619 | 1 | |
| I notice that I work slower although I dedicate all time on | 596 | 1 | |
| the computer for work | ,380 | | |
| I feel hatred towards e-mail, computer and other ICT | 173 | | |
| related to work | ,+75 | | |
| At night, I think to whom to contact and what assignments | 413 | | |
| to accomplish, thus my sleep is superficial | ,115 | | |
| F3. Satisfaction in individual life | | | |
| Satisfaction in time dedicated to socializing with my | 783 | | |
| family and relatives | ,705 | | |
| Satisfaction in balance of work and personal time | ,777 | | |
| | | | |
| Satisfaction in my personal life in general | ,726 | | |
| Satisfaction in my personal life in general Satisfaction in time for socializing with my friends | ,726 ,722 | A AA2 | 0.886 |
| Satisfaction in my personal life in general Satisfaction in time for socializing with my friends Satisfaction in the reserves of my inner energy | ,726 ,722 ,718 | 4,442 | 0,886 |
| Satisfaction in my personal life in general Satisfaction in time for socializing with my friends Satisfaction in the reserves of my inner energy Satisfaction in my health state | ,726 ,722 ,718 ,691 | 4,442 | 0,886 |
| Satisfaction in my personal life in general Satisfaction in time for socializing with my friends Satisfaction in the reserves of my inner energy Satisfaction in my health state Satisfaction in my job results | ,726 ,722 ,718 ,691 ,545 | 4,442 | 0,886 |
| Satisfaction in my personal life in general Satisfaction in time for socializing with my friends Satisfaction in the reserves of my inner energy Satisfaction in my health state Satisfaction in my job results Satisfaction in my work situation | ,726 ,722 ,718 ,691 ,545 ,539 | 4,442 | 0,886 |
| Satisfaction in my personal life in general Satisfaction in time for socializing with my friends Satisfaction in the reserves of my inner energy Satisfaction in my health state Satisfaction in my job results Satisfaction in my work situation Satisfaction in ICT which I use for work | ,726 ,722 ,718 ,691 ,545 ,539 ,495 | 4,442 | 0,886 |
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| Satisfaction in my personal life in generalSatisfaction in time for socializing with my friendsSatisfaction in the reserves of my inner energySatisfaction in my health stateSatisfaction in my job resultsSatisfaction in my work situationSatisfaction in ICT which I use for workF4. The dependence of assignment accomplishment on ICAll the required information in my work is shared throughICT networks – internet or intranetThe absolute majority of internal communication processesin my work take place with the help of ICT | ,726 ,722 ,718 ,691 ,545 ,539 ,495 CT ,769 ,739 | 4,442 | 0,886 |
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| Satisfaction in my personal life in generalSatisfaction in time for socializing with my friendsSatisfaction in the reserves of my inner energySatisfaction in my health stateSatisfaction in my job resultsSatisfaction in my work situationSatisfaction in ICT which I use for workF4. The dependence of assignment accomplishment on ICAll the required information in my work is shared throughICT networks – internet or intranetThe absolute majority of internal communication processesin my work take place with the help of ICTIn more than 50 per cent of the cases, the externalcommunication in my work (e.g. with clients) takes place | ,726 ,722 ,718 ,691 ,545 ,539 ,495 CT ,769 ,739 ,715 | 4,442 | 0,886 |
| Satisfaction in my personal life in generalSatisfaction in time for socializing with my friendsSatisfaction in the reserves of my inner energySatisfaction in my health stateSatisfaction in my job resultsSatisfaction in my work situationSatisfaction in ICT which I use for workF4. The dependence of assignment accomplishment on ICAll the required information in my work is shared throughICT networks – internet or intranetThe absolute majority of internal communication processesin my work take place with the help of ICTIn more than 50 per cent of the cases, the externalcommunication in my work (e.g. with clients) takes placewith the help of ICT | ,726 ,722 ,718 ,691 ,545 ,539 ,495 CT ,769 ,739 ,715 | 4,442 | 0,886 |
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| The possibilities provided by the computer has changed paper documents, telephone, fax and many other work | ,566 | | |
|---|------|-------|-------|
| means in my work | | - | |
| I could not accomplish my duties without a computer | ,555 | | |
| F5. Intensity of everyday work | 1 | 1 | |
| I cannot unambiguously identify the beginning and the end | 726 | | |
| of work stages because new tasks appear with every e-mail | ,/36 | | |
| Or phone call | | - | |
| My work routine is very intense. I always work through | 701 | | |
| programs phone etc. | ,/01 | | |
| In order to cope with the amount of assignments. I have to | | | |
| work quicker than before | ,691 | 3,809 | 0,782 |
| Due to the ICT use in my work I experience work | | | |
| overloads i.e. Last more assignments than the official time | 615 | | |
| dedicated to them | ,015 | | |
| My organization's employees are expected to accomplish | | - | |
| more assignments in the same period of time due to | 517 | | |
| progress of ICT | ,517 | | |
| F6 Physical wellbeing | 1 | | |
| I suffer headache which do not fade without taking drugs | 686 | | |
| I am troubled by unpleasant unexplainable physical | ,000 | - | |
| symptoms and health disorders | ,675 | | |
| I suffer spine and name pains | 668 | 3,092 | 0,816 |
| I suffer eve nains | 592 | | |
| I feel that I lack physical energy more and more often | 528 | | |
| F7 Socioemotional effect of work out of working hours | ,520 | | |
| Working from home after working hours or during | | | |
| weekends irritates my relatives | ,818 | | |
| When I have to work from home after working hours it | | | |
| makes me irritated | ,792 | | |
| Working after working hours harms my family and | | | |
| relation with my friends and relatives | ,753 | 2,677 | 0,845 |
| Although ICT provides me with a possibility to | | | |
| accomplish urgent assignments in the evenings, on | | | |
| weekends and during vacation, it reduces the quality of my | ,723 | | |
| personal life | | | |
| F8. Practice of working after working hours | | 1 | |
| I check my email during weekends, vacation and in the | 7(2) | | |
| evenings after work hours | ,/62 | | |
| I can decide to work from home. The organization | (02 | | |
| motivates such practice | ,693 | | |
| I have a possibility to work from home if I am ill, have to | 601 | 2,416 | 0,743 |
| look after an ill child and so forth. | ,091 | | |
| If I did not dedicate any time for work during weekends, I | | | |
| would face a huge avalanche of e-mails and messages at | ,684 | | |
| work on Monday | | | |
| F9. Intensity of ICT update and necessity of life-long lear | ning | | |

| The organization constantly renews computers, updates software and hardware | ,760 | | |
|---|--------|----------|--------|
| Our organization annually installs a new program to communicate, cope with assignments (e.g. plan, execute projects) etc. | ,731 | 2,132 | 0,719 |
| Almost everyone in our organization uses the newest ICT at work | ,686 | | |
| The structure of organization's website is changed or edited every year | ,502 | | |
| F10. The requirements of time resources for work with I | СТ | | |
| I spend a lot of time in order to learn how to use the technological novelties required for everyday work | ,714 | | |
| Sometimes I feel outpaced by younger colleagues in the field of technologies as they work with ICT faster than me | ,655 | 2,037 | 0,668 |
| I do not have enough time to get accustomed to all ICT novelties beneficial in my work and use the new technical possibilities | ,624 | | |
| F11. Organization's activity in social networks | | | |
| The organization has its account in social networks | ,781 | | |
| The organization's policy indicates that employees should represent the organization in social networks, e.g. LinkedIn, Facebook etc. | ,778 | 1,825 | 0,583 |
| F12. Networking at work | | | |
| We have a joint catalogue in the internal network, where all official documents are held | ,757 | | |
| In my organization, employees execute some particular assignments in the internal organization's network, e.g. fill out reports, prepare documents, upload or download information, exchange data etc. | ,732 | 1,639 | 0,670 |
| F13. The influence of knowledge and skills on th | e acco | omplishm | ent of |
| assignments | - | | |
| I must constantly update my knowledge of ICT in order to successfully accomplish my duties | ,545 | 1 560 | 0.554 |
| I have to be able to use the ICT in my organization in order not to get sacked for not accomplishing assignments | ,488 | 1,307 | 0,334 |

L – factor loadings, % - percentage of variance explained, α – Cronbach α value KMO measure of sampling adequacy = 0,932, total variance explained = 59,130%.

Table 4. The results of technostress factor analysis.

5. Conclusions

During the technostress factor research, a survey consisting 71 question was prepared based on the theoretical analysis in the field. After a factor analysis of the sample consisting of 1013 individuals who use ICT in their everyday work, it became clear that 13 factors combine 68 questions and can explain 59.130 per cent of the answer dispersion. These factors are: the influence of leadership and job management on employee commitment; the effect of work intensity to psycho-

emotional state; satisfaction in individual life; the dependence of assignment accomplishment on ICT; intensity of everyday work; physical wellbeing; socioemotional effect of work after working hours; practice of working after working hours; intensity of ICT update and necessity of life-long learning; the requirements of time resources for work with ICT; organization's activity in social networks; networking at work, and the influence of knowledge and skills on the accomplishment of assignments.

Factor analysis enabled to reframe the questionnaire and to plan to analyze the respondents' answers, revealing the causes of technostress as well as its consequences and prevalence in the population in a statistically validated pattern. Having distinguished the factors of technostress we can analyze their dependence on the respondents' age, gender, family status, role at organization, and emergence of technostress in the particular sector. The research created a possibility to clarify and - most importantly - to influence the phenomenon of technostress in practice.

The key factors of technostress based on factor analysis can also serve for the construction of technostress intensity measurement scales in further research.

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