

Reviewing Literature on Time Pressure in Software Engineering and Related Professions

Computer Assisted Interdisciplinary Literature Review

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Abstract — During the past few years, psychological diseases related to unhealthy work environments, such as burnouts, have drawn more and more public attention. One of the known causes of these affective problems is time pressure. In order to form a theoretical background for time pressure detection in software repositories, this paper combines interdisciplinary knowledge by analyzing 1270 papers found on Scopus database and containing terms related to time pressure. By clustering those papers based on their abstract, we show that time pressure has been widely studied across different fields, but relatively little in software engineering. From a literature review of the most relevant papers, we infer a list of testable hypotheses that we want to verify in future studies in order to assess the impact of time pressures on software developers' mental health.

Keywords; *Software engineering; time pressure; speed-accuracy tradeoff; Job demands-resources model, deadline pressure, topic analysis*

I. INTRODUCTION

Time pressure has been shown to associate with arousal, negative emotions and perceived stress, these in turn have some strong physiological correlates, such as an increased heart rate and hormonal responses. Stress also intensifies all other emotions [1], e.g. frustration can change to anger. Several theories on the outcomes of time pressure on performance and motivation exist. Among them are Yerkes Dodson's law [2], Job demands-resources model [3] and Speed-accuracy tradeoff [4].

Yerkes Dodson's law [2] dictates a U-shaped relation of time pressure and performance. Performance increases with arousal, but when arousal lasts too long, or the level of arousal is too high, performance starts to decrease. Moreover, performance decreases without arousal. In software context, this means deadlines can increase the performance of developers, but when the requisites for deadlines become too high the performance decreases.

Job demands-resources model [3] generalizes every job as having demands, often defined as time pressure, and resources. It examines the relationship between job demands

and resources and their effects on strain and motivation. The model assumes that job strain is caused by imbalance between resources and demands, such as lack of time or too much demand before the next deadline.

Speed-accuracy tradeoff [4] is a phenomenon observed among humans and animals alike. It has been observed that decision speed covaries with decision accuracy. Simply put, quickly made decisions contain more errors, which in software development context might prove costly.

Software development offers data for researchers, which may be lacking elsewhere: analyzable data of work performance exists in software repositories in the form of commit and chat logs. Observing and predicting time pressure could be used to maintain optimal time pressure and avoid burnouts, thus improving the job wellbeing of individual developers and boosting their performance per Yerkes Dodson's law.

This study aims to explore the literature related to time pressure by performing a computer assisted interdisciplinary literature review. Our approach is motivated on our observation that time pressure has been studied in multiple disciplines and hundreds of papers about the topic have been published. Our goal is to offer motivation and theoretical background for a time pressure detection framework specific to the field of software development. Additionally, some literature from other fields is reviewed to see whether lessons from elsewhere could be useful in a software development context.

The remainder of the paper is structured as follows. First Section II presents the general methodology we used to extract and analyze 1270 papers found on Scopus and related to time pressure. In Section III we present the result of the clustering of those papers' abstracts. In Section IV we review the most relevant papers related to software engineering, but also from other fields from which we can potentially gain knowledge that can be transposed to software engineering. In Section V, we discuss potential hypotheses found in the literature and how they could be studied in software repositories. Finally, the paper concludes by presenting our planned future work.

II. METHODOLOGY

Scopus database was used to gather information on papers related to time pressure. Scopus provided all information used in analysis, including titles, abstracts and citations. The data from Scopus was collected on 9th November 2016 with the search string “(TITLE (“time pressure”) OR KEY (“time pressure”) OR TITLE (“schedule pressure”) OR KEY (“schedule pressure”) OR TITLE (“time budget pressure”) OR KEY (“time budget pressure”) OR TITLE (“deadline pressure”) OR KEY (“deadline pressure”) OR TITLE (“pressure of time”) OR KEY (“pressure of time”) OR TITLE (“pressure of schedule”) OR KEY (“pressure of schedule”) OR TITLE (“pressure of time budget”) OR KEY (“pressure of time budget”) OR TITLE (“pressure of deadline”) OR KEY (“pressure of deadline”) OR TITLE (“speed-accuracy tradeoff”) OR KEY (“speed-accuracy tradeoff”) AND NOT TITLE-ABS-KEY (“long rise-time”) AND NOT TITLE-ABS-KEY (intracranial) AND NOT TITLE-ABS-KEY (drill) AND NOT TITLE-ABS-KEY (space-time))”. The search string contains several search terms and different ways of spelling them, all related to time pressure. Additional search terms were found by familiarizing with the search results and improving the search string incrementally. The search from Scopus yielded a total of 1378 papers. This initial dataset was further filtered both by hand and programmatically, bringing the amount of papers down to 1270 papers. This was done by searching for entries containing suspect strings (e.g. “time, pressure” and “real-time pressure”) and reading them through. This resulted in finding papers from the data that deal with thermodynamics, which were clearly out of scope and thus were excluded.

The filtered data was further analyzed with Excel and R. Clustering of the data was done using R package *topicmodels*, using latent Dirichlet allocation (LDA) and Gibbs sampling. This means that each paper is only assigned to one cluster or topic, the approach has been introduced in a widely cited paper by Griffiths and Steyvers[5]. Optimal number of topics was selected using a log-likelihood measure, which provided 79 topics.

III. RESULTS OF CLUSTERING

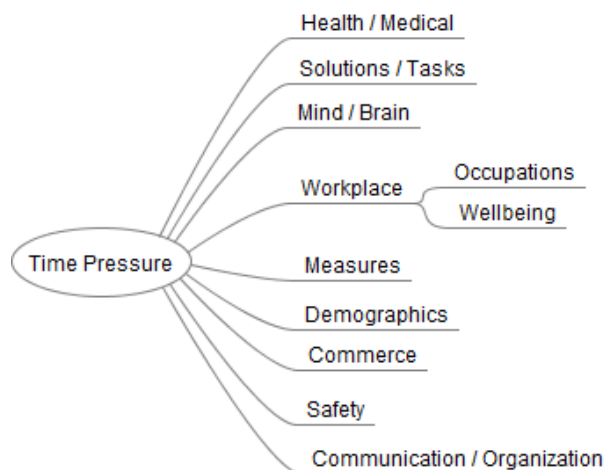


Figure 1. High level of qualitative coding

The acquired 79 topics were qualitatively encoded using FreeMind tool, further clustering the topics and making them

easier to perceive. Qualitative coding was assisted by examining the papers each topic contains. The highest level of the qualitative coding, depicted in Figure 1, contains nine different nodes: Safety, Workplace, Solutions / Tasks, Commerce, Communication / Organization, Mind / Brain, Measures, Demographics and lastly Health / Medical. One topic can be under several nodes.

Node Safety has five different topics and are related to accidents, emergencies and states and substances influencing behavior e.g. fatigue and alcohol. Workplace is divided into two nodes, Occupations containing 12 different topics and Wellbeing containing 5 topics. Wellbeing focuses on the effects of work with probable words such as job satisfaction, burnout, and emotional wellbeing as well as working patterns: maintenance, day, pattern and shift. Node Solutions/Tasks has 10 different topics related to studied tasks such as visual searching and solutions such as adaptive keyboards. Six different topics under node Commerce are related to commercials, shopping, products and finances while nine topics under node Communication / Organization are related to words such as groups, negotiations and collaboration. Node Mind / Brain is divided into several nodes under it: brain functions, mental states, decision-making and behaviour. Measures contain two topics with words such as pupil, diameter and stimulus. Node demographics contains 5 topics with words that are demographic variables, such gender, elderly, adults and children. Lastly, node Health / Medical contains five different topics with words related to the medical field such as controls, patients, symptoms, food, consumption, services, medical and care.

IV. OVERVIEW OF TOPICS RELATED TO WORKPLACE

The clustering yielded several topics related to occupations which can be viewed in Figure 2. In addition to reviewing papers under topic software engineering, we review relevant papers on topics project work and auditing that we consider related to software engineering, as those areas can have findings relevant to software engineering. Project work is part of software projects, while auditing may be considered to require similar attention to detail as programming. We also review papers that were clustered to topic general job satisfaction, as they are certainly relevant to software engineering.

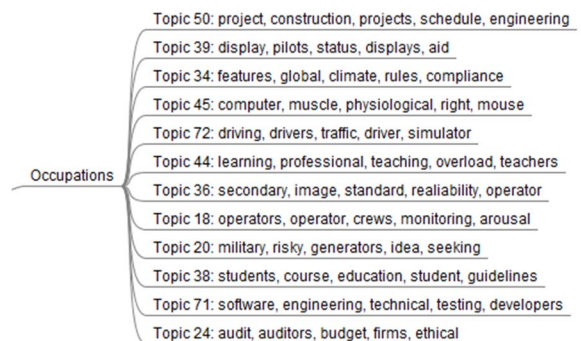


Figure 2. Topics belonging to the node “Occupations”.

Cataldo [12] analyzed data from over 200 software projects by a globally distributed organization to see common causes for errors and implications for the use of collaborative tools. The main outcome variable was the number of defects reported during integration and testing, while time pressure was computed as the standard deviation of the number of completed tasks in each month. He found out that most significant source of errors were affected by time pressure and uneven distribution of workers across locations. Other sources, which paled in comparison, were identified as the technical experience of project members and technical dependencies of the project.

Interestingly, the topic also contained one paper related to information systems dating back to 1994 [13], which highlights that researchers interested in human factors and information systems were already interested in time pressure twenty years ago. Hwang [13] suggested a model that defines how time pressure should impact decision performance, decision strategy, task difficulty, goal commitment and information systems based on studies in other fields.

C. Auditors and Auditing

Similarities in the work of auditors and software developers can be found as both jobs require attention to the detail and understanding of rules. Hence it was decided to overview this topic made with clustering. This topic's five most probable words are "audit", "auditors", "budget", "firms" and "ethical" and it consists of 26 papers in total.

Job performance in relation to time pressure has been extensively researched in auditing. Broberg, Tagesson, Argento, Gyllengahm and Mårtensson [14] examined with surveys whether "time budget pressure" influenced audit quality in Sweden. Negative relationship between audit quality and "time budget pressure" was indeed noted, additionally having more clients also impacted audit quality negatively.

The authors of the study also noted a contradiction, their research shows that "time budget pressure" is influencing the quality of work for the worse, but not the well-being of the auditor, which calls for further studies. Similar results were also produced by surveying small audit firms [15]. On the other hand, unusually long audit times have been linked with a large number of errors in original reports [16], suggesting that fraudulent misstatements are detected less under time pressure [17]. Auditors specialized in a specific industry, experience less time pressure than non-specialized ones, however the size of the company being audited has no effect [18]. Experienced auditors make less errors under time pressure [19]. Time pressure had also been linked to under reporting of overtime [20].

In an experiment done by Bowrin and King [21], the U-shaped performance predicted by Yerkes Dodson's law could not be replicated in auditing tasks. Auditors performance did not decrease with low time pressure. The authors note that the tasks and its context in the research setting might not bring arousal down to a low level associated with decreased

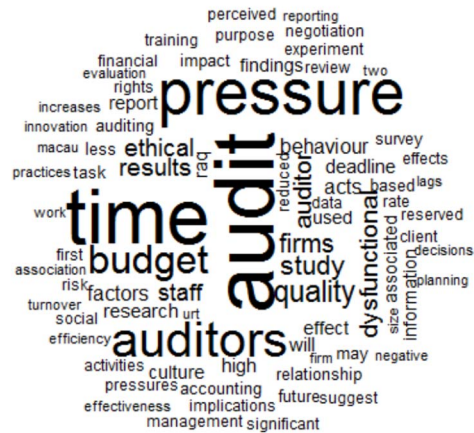


Figure 5. Wordcloud of topic "auditors" made from titles and abstracts.

performance. Otherwise the authors detect that performance decreases with increased time pressure. Additionally, the performance decrease is greater in the more complex task of the two used in the study.

There has also been research on the effects of time pressure on negotiations between auditors and their clients chief financial officers [22]. Based on surveys, it was deemed that auditors with time pressure conceded less in pre-negotiations, but were willing to concede more than their clients during negotiations.

Time pressure has also been linked to the ethicality of decisions in auditing [23]. This conclusion was based on questionnaires distributed in Ireland and USA. The country of the respondent had an effect on the results as the respondents from the USA reported overall more ethical practices. Results also indicate that ethical behavior was less affected by pressure created by management than by social pressure induced by peers. Hence the authors note that: "While management can expend considerable resources to establish and communicate the appropriate tone at the top, they must also find ways to ensure that regular work pressure experienced by staff does not conflict with the espoused values of the firm".

D. Job Satisfaction

The topic with the five most probable words "job", "satisfaction", "physicians", "workers" and "organizational" was put under two high level nodes in qualitative coding: "Occupations" and "Wellbeing". Most of the 17 papers on this topic are related to Job Demands-Resources model [3].

In general, time pressure associates with job satisfaction negatively [24]. Surveys tell that child welfare supervisors who report time pressures also report more stress, while a direct link to intent leaving one's job could not be found [25].

Silla and Gamero [26] studied time pressure in the organizational level and call it "shared time pressure". In their study, 367 workers from 34 organizations in the road transport sector answered surveys on time pressure. Results indicate that time pressure has a negative effect on job satisfaction and self-reported health, but no connection to sickness and absence from workplace could be made. Possible explanation

There are some possibly conflicting reports in the overviewed literature, Bowrin [21] notices a bigger effect of time pressure on more complex tasks in auditing, while Häusser [27] does not find less accuracy with more demands in office work simulation. This is further pointing out towards the context dependent nature of time pressure.

As future work, we plan to mine different software repositories in order to test several of those hypotheses using metrics such as valence and arousal. Comparing the results obtained on different software projects would allow us to gain knowledge on what type(s) of time pressure policies positively affect both software developers' emotions and health, and thus software development. Moreover, this work can be further expanded by overviewing more topics found by clustering and adding bibliometric data. More papers about software engineering time pressure can be covered by performing snowballing from the identified sources.

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