# CHALLENGES OF WORKING FROM HOME IN SOFTWARE DEVELOPMENT DURING COVID-19 LOCKDOWNS

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The COVID-19 pandemic in 2020/2021/2022 and the resulting lockdowns forced many companies to switch to working from home, swiftly, on a large scale, and without preparation. This situation created unique challenges for software development, where individual software professionals had to shift instantly from working together at a physical venue to working remotely from home. Our research questions focus on the challenges of software professionals who work from home due to the COVID-19 pandemic, which we studied empirically at a German bank. We conducted a case study employing a mixed methods approach. We aimed to cover both the breadth of challenges via a quantitative survey, as well as a deeper understanding of these challenges via the follow-up qualitative analysis of fifteen semi-structured interviews. In this paper, we present the key impediments employees faced during the crisis, as well as their similarities and differences to the known challenges in distributed software development (DSD). We also analyze the employees' job satisfaction and how the identified challenges impact job satisfaction. In our study, we focus on challenges in communication, collaboration, tooling, and management. The findings of the study provide insights into this emerging topic of high industry relevance. At the same time, the study contributes to the existing academic research on work from home and on the COVID-19 pandemic aftermath

CCS Concepts: • Software and its engineering → Programming teams; Open source model; Agile software development.

Additional Key Words and Phrases: Distributed Software Development, DSD, COVID-19, Coronavirus, Corona Crisis, Lockdown, Mixed Methods, Open Source, Work from Home, Remote Work

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#### 1 INTRODUCTION

For decades, the management, development, and maintenance of software have been changing from being at a single location to a distributed network, also called Distributed Software Development (DSD), sometimes even globally

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distributed (GSD, GDSD) [16, 39, 69, 77]. However, many companies traditionally developed software from fixed places of work, such as offices [28]. The COVID-19 pandemic and its countermeasures prompted a rapid shift to work from home for many employees worldwide, including software professionals in non-tech companies, many of whom were previously working from fixed offices [10, 26, 30, 61, 70]. In the study, we focus on this special case of DSD, characterized by software professionals having to shift swiftly and unexpectedly from working together in a physical location to working individually from home, without much preparation. We found this new form of DSD is not only quantitatively larger (as the crisis and the changed working conditions involved hit everyone) but also different from traditional DSD. DSD, caused by the COVID-19 pandemic, induced a row of specific organizational and engineering challenges [6, 13], such as the perception of having too many meetings, feeling overworked, and experiencing negative impact on physical and mental health as reported in a study at Microsoft in 2021 (after shifting to work from home during the pandemic). Other challenges included reaching milestones and a perceived decrease in team productivity resulting from two surveys with 2873 developer responses [61]. In our study, we confirmed these findings and identified deeper insights thanks to our follow-up qualitative study. We echo the above-mentioned challenges and confirm communication challenges in part resulting from excessive meetings, as well as employee satisfaction challenges. We also explore the novel challenges to the forced shift to work from home, while drawing parallels with traditional DSD research. We recognized that many of the solutions required to solve the challenges exist and are used in DSD companies. Some solutions from the recent COVID-era literature include "No Meeting Friday" programs [13] and fostering peer support culture [61].

For this study, we defined our research scope to focus primarily on common challenges software professionals faced due to the work from home during the pandemic and to compare and contrast them to known challenges in DSD. In particular, we studied the corporate challenges regarding internal communication, collaboration, tooling, and management, while also assessing the effects on employee satisfaction. Even if we hint at some potential solutions, the focus on this paper is on the challenges of working from home in software development.

We started by reviewing related literature on DSD and work from home regarding challenges that arise due to the geographical distribution of contributors or employees according to the methodology described by Webster and Watson [99]. For our main analysis, we followed the sequential explanatory mixed methods approach by Creswell and Plano Clark [20].

We chose a German bank as the subject of our case study. As a consequence of the COVID-19 lockdown in March 2020, the employees of the company under study were asked to change their workplace from the office to their homes. In our survey we analyzed the situation of software professionals of this company while working from home and thus experiencing a form of DSD. Afterwards we conducted fifteen in depth expert interviews. Therefore, we chose experts from the company of our case study and from other companies. To compare and contrast derived challenges from the case study to traditional DSD challenges, we chose experts from various countries with different levels of experience in DSD.

Both data collection and analysis were conducted by an interdisciplinary team of researchers including experts from software engineering, labor economics, and social sciences research institutes as well as from business. This investigator triangulation led to wide knowledge in different research methods and generated a broad perspective for discussion and analysis of this interdisciplinary topic [92].

The paper is structured as follows: In section 2, we present a review of related literature. In section 3, we explain our research approach and methodology. In section 4, we present the research results. In section 5, we discuss the results as well as the limitations of the study, including threats to internal and external validity. In section 6, we conclude the paper.

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#### 2 RELATED WORK

Challenges in DSD are established research subtopics of software engineering literature. In this related work section we present some of the prominent literature on the topics of DSD and work from home. Our goal for this literature review was to identify the known challenges and challenge categories in DSD and work from home, as well as to find some proposed and tested best practices for dealing with these challenges. We used the findings of the literature review to design the rest of our study, namely the survey and interview questions we used to identify the specific challenges and perceived solutions of working from home among our study participants.

In this paper, we use the term DSD to encompass "global", "distributed", "multi-site" software development and define it as "the management, development, and maintenance of software being geographically distributed across the globe" [77]. While we found multiple definitions and nuances between each term, we decided to take this broad approach because our topic was sufficiently and equally distinct from the terms above. In our case, we focus on the special form of DSD where the management, development, and maintenance of corporate software was performed exclusively from home during the COVID-19 pandemic resulting from a forced and rapid transition to this work setup. We refer to this phenomenon under investigation as work from home throughout the paper. While similar in some practical aspects to DSD, work from home in this context had distinct challenges, such as collaboration issues due to the rapid and often little organized transition, communication gaps and problems due to the new and unfamiliar work setup, as well as tooling and management issues. The latter two had to be adapted swiftly and with little preparation due to the nature of the COVID-19 lockdowns starting in March 2020 in Germany.

Following the literature review methodology by Webster and Watson [99], we systematically searched for and identified the relevant literature on challenges in distributed software development in general and on work from home challenges of software professionals during the COVID-19 lockdown in particular. We recognized that the very discipline of global DSD has been transforming rapidly over the last two decades [38, 39]. This trend was accelerated by the COVID-19 pandemic, as well as the widespread adoption of remote work tools, such as Zoom, GitHub, GitLab, and many more. Our goal was to validate our research objective and refine our research design including the research questions, to get an overview of existing related literature in the context of the COVID-19 pandemic and to compare known challenges in DSD before the pandemic to those employees faced due to the work from home during the pandemic. We present our findings and the above-mentioned comparisons in the discussion section of this paper, where we compare and contrast our research results next to the literature findings.

One significant finding of our literature review was that while there is a lot of literature addressing DSD and work from home challenges in general, few authors focus on the enforced, unplanned transition to work from home for software professionals. Our study comes to bridge this gap and to provide insights on this highly relevant topic using German corporate context for the research. While recognizing the high relevance of this topic, we also focused on the rigor of our research methods and data collection, which ensures the overall quality of the paper, as well as its repeatability and data traceability.

This is an interdisciplinary study focusing on software engineering, work from home, and DSD, which was reflected in our literature search strategy and resulting search terms. We searched for related literature in software engineering, management, and psychology, as well as in information systems scholarship.

#### 2.1 Work from Home Challenges due to COVID-19 and Effects on Job Satisfaction

Work from home is not a new reality for software development [79]. Though, the World Health Organization [100] declared the situation from 2020 onward a Public Health Emergency of International Concern and many countries declared states of emergency or lockdowns. As a consequence, many employees were asked to work from home [7]. Therefore, the situation under review is not a case of regular work from home but involuntary distributed work, enforced unexpectedly, during an unprecedented public health crisis [73]. Thus, the prevailing knowledge base of work from home may not apply and new challenges may arise [25, 73].

Communication was identified as one out of four key work from home challenges by Wang et al. next to work-home interference, procrastination, and loneliness [98]. Communication difficulties were also identified by other studies investigating the work from home challenges during the crisis [1, 34]. Further highlighted challenges included less defined work-life boundaries, higher need for self-discipline, reliance on private infrastructure, coordination and collaboration issues [1, 34]. This is in line with the results of two literature reviews regarding the challenges of software professionals during COVID-19 that both identified communication and collaboration issues as the main challenges during the forced work from home [64, 67]. We decided to focus our study on these two categories namely communication and collaboration where challenges may occur. We structured our paper according to them.

Using adequate tools set the basis for effective communication and collaboration in distributed teams [88]. Many companies had to swiftly adapt their tools to remote work due to the new situation evoked by COVID-19 [3]. Thus, we also analyzed tooling related challenges in this study.

Furthermore, we were interested in management challenges. According to Ferreira et al. [29], managerial issues are one of three main work from home challenge categories during the COVID-19 pandemic. As this is a very broad field, we have focused on some aspects of management such as authority and decision making, and on some aspects of the control process such as internal management and requirements change management.

Only a number of studies [13, 32, 43, 61, 73, 79, 82], focus explicitly on work from home challenges of software professionals during a pandemic of this magnitude because there has not been a pandemic of this scale since before the invention of the world wide web [73]. Before 2020, some researchers studied similar challenges on a smaller scale, such as the home-based teleworking in the aftermath of a natural disaster [25].

While Spataro et al. [82] analyzed the challenges of the new unplanned remote work setting due to COVID-19 for developers in general and proposed remote-friendly tools and processes, the other studies referenced above analyzed the shift to work from home regarding certain aspects: Forsgren [32] thereby focused the impact on the themes: productivity and activity, work cadence, and collaboration, Ralph et al. [73] emphasized productivity and wellbeing and Silveira et al. [79] analyzed the influence on daily activitites.

The studies mentioned above mainly focus on large technology companies [32, 73, 82], such as Microsoft [13]. Behrens et al. [8] found that whether work from home has positive or negative consequences for software professionals depend on the interplay between the extent of work from home and the efficiency of information and communication technologies. We assume that large technology companies have more experience with distributed work and therefore necessary technologies are already established. In our study, we conducted a case study at a medium-sized non-tech company, where software professionals were not used to entirely distributed work.

Beyond the work from home challenges caused by COVID-19 pandemic, our study focused on job satisfaction. While job satisfaction is manifoldly defined in software engineering literature, in the context of our study, we refer to the definition of Locke [58] who described job satisfaction as "a pleasurable or positive emotional state resulting from the

appraisal of one's job or job experiences". We followed this definition, when designing the survey questions and the interview questionnaire used in our study to assess the shifts in job satisfaction levels after the forced transition to work from home.

According to our literature review, job satisfaction is one of the most important aspects of a company to stay attractive as an employer [12, 18, 101]. Workers with high levels of job satisfaction are more likely to be committed to the organization and demonstrate a decreased propensity to leave [18, 101]. While many of the already published studies on challenges for software professionals due to the COVID-19 pandemic emphasized the impacts on productivity [32, 73, 82] we decided to analyze effects on job satisfaction. This also refers to the findings of Silveira et al. [79] who highlighted that the impact of the COVID-19 pandemic is not reduced on a shift of the employees' productivity but rather on a spectrum of many aspects that, beside others, includes wellbeing.

## 2.2 Known Challenges in DSD

Some scholars predict that the pandemic will make certain jobs permanently remote [40, 87]. Thus, it is also practically important to explore how to solve actual challenges in work from home [97]. In doing so, understanding differences and similarities to existing practises could help to identify which of these may be applied or further developed. For identifying similarities and differences, we analyzed literature in DSD before the COVID-19 pandemic. The challenges in software development that arise due to the geographical distribution of contributors or employees are studied broadly and there are plenty of valuable case studies and various literature reviews on this topic. Below we provide an overview of known DSD challenges in our fields of study stemming from our literature review, namely in collaboration, communication, tooling, management, and control process.

2.2.1 Collaboration. In the literature, distributed collaboration is seen as one of the main challenges of DSD [22, 46, 47, 66, 81, 85].

Thereby, asynchronous collaboration is identified as a main challenge as it slows down decision making, issues clarification, and thus delays projects [46, 47]. On the other hand, synchronous collaboration in distributed projects is often impossible because of different time zones in global distributed projects or, in our case, other factors like child care, home schooling or several parallel meetings.

Also establishing or maintaining team spirit and group awareness is an often addressed challenge in the field of collaboration [66, 85]. Former studies identified more human-centred, agile, and collaborative working modes as beneficial for successful DSD [21, 37, 42]. This is in line with the findings of o'Leary et al. [65] who propose social factors like leadership skills, empathy, and motivation as crucial for successful distributed collaboration.

However, contrary to former research that mainly addressed collaboration challenges between multiple sites of a company [22, 81], in our study we focused on the collaboration of a highly distributed organisation where every employee is working from a different location namely from home. According to Šmite et al. [81] there is a clear lack of studies about this aspect of distributed collaboration.

2.2.2 Communication. Communication challenges are often addressed in the literature and therefore we also emphasized this topic in our study. Challenges in communication include finding the right balance between loosely and tightly coupled work and between synchronous and asynchronous communication as well as the lack of personal contact and trust [4, 11, 17, 62, 63, 81].

Missing personal contact is a frequently addressed impediment to proper communication in literature [6, 61]. As mentioned in the introduction, respondents from the survey by Miller et al. [61], who were forced to shift to work

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 from home, reported communication issues, such as the limited ability to brainstorm with colleagues and decreased satisfaction from interactions and virtual social activities. The latter negatively affected software development team's productivity.

Further research revealed that "limited face-to-face meetings reduce informal contact and this can lead to reduction of teamness, loss awareness of task, and decreased trust" [4]. In related studies, implications for practice often propose common conferences and business trips to enable personal contact in distributed teams [62, 81, 84].

Also the frequency of communication (tightly vs. loosely coupled work) is discussed in literature [11, 63]. While tightly coupled work necessitates frequent communication and is usually non-routine, loosely coupled work is typically either routine or has fewer dependencies [63]. Another challenge often addressed is finding the right balance between synchronous and asynchronous communication which could depend from task to task and from the frequency of communication mentioned above [14].

2.2.3 Tooling. Smite et al. [81] found that technical-oriented research about DSD challenges mainly focuses on implementing effective infrastructure and providing tool support. In their literature review focusing on DSD challenges da Silva et al. [21] take up the subject by providing a set of tools supporting DSD. Major challenges regarding tooling are inappropriate selection of communication technologies as well as the lack of tool supported training and knowledge sharing [48, 78, 102].

Due to the COVID-19 pandemic, employees were forced to use tools in new ways to perform their work and to engage with their colleagues [96]. As many studies reported a rapid adoption of digital technologies and tools due to the enforced work from home [2, 96], we also addressed this topic in our study.

2.2.4 Management. Also challenges related to management, coordination, and control are frequently analyzed [62, 76, 78]. The importance of management is strengthened by the literature review of Khan et al. [53] who stated that management commitment is one of the most crucial factors for successful distributed software development. Saleem et al. [76] found project and process management one of the main challenges in all three levels of operation: country, company and team.

DSD research mentions the challenge of not knowing who is in charge of what due to different company sites and fast changing environments and thus a slowdown in decision-making [62]. This is in line with the finding that centralized authority has a negative influence on member satisfaction and team identification [63] which calls for adapting agile practices including democratic decision-making.

In distributed agile development, as we also can find it in our case study, lack of management commitment as well as lack of roles and responsibilities are main challenges identified in the literature review of Shameen et al. [78] and hinder proper planning and prioritization.

2.2.5 Control Process. Another key challenge of distributed software development is the control process in the context of the geographical distribution of software developers [49]. They define control processes to include internal management and reporting of the software quality, budget, and standards. This is especially challenging for global software development (GSD), be it in open source projects or companies operating across multiple countries and time zones. Kahya and Seneler [49], among others [52, 75], recently conducted a case study at a global company to uncover the GSD challenges resulting from the geographical distance between different parts of the company and their employees working across different countries around the world.

They found that companies that switch to global software development face temporal, geographical, and sociocultural distance challenges [49, 75]. Moreover, they identified that to mitigate such challenges, companies introduce agile software development methods, which, however, comes with its own challenges, as agile development requires synchronous communication and control processes that are difficult to conduct across different times zones and cultures.

As a result of their empirical study with twelve participants at a Germany-based global company, Kahya and Seneler suggest that switching to GSD work setup carries risks in communication, coordination, and control processes for companies. Communication and coordination challenges are in line with our previous findings presented in subsections above.

Other researchers also mention the challenge of control processes, for example in the context of requirements change management in GSD setup [52]. In COVID-19 related literature about work from home the challenge of control processes was not a major topic. We have therefore decided to include aspects such as requirements change management in the management challenges sub-category and to no longer have the control process as a separate category.

#### 2.3 Research Questions

After analyzing literature about challenges in work from home due to the COVID-19 pandemic and known challenges in DSD, the encompassing research questions aiming to achieve the research objective and refined by reviewing related literature are:

- What are the main challenges of software professionals resulting from the switch to work from home?
- How do these challenges impact job satisfaction of software professionals?
- Are the challenges similar to the prevailing knowledge base of DSD challenges?

Our narrow focus on challenges of software professionals in a medium-sized, non-tech company and how these challenges affect job satisfaction allows us to extensively study an important field. In the literature we found challenges that we wanted to further analyze in this study in communication, collaboration, tooling, and management including control process. For further analyzing we employed mixed methods research, which we cover in detail in the following section.

#### 3 RESEARCH METHOD

#### 3.1 Mixed methods research

3.1.1 Study design. To develop a detailed understanding of the main challenges in work from home during the COVID-19 lockdown we used a mixed methods approach [90]. Mixed methods research is characterized by integrating both quantitative and qualitative data within a single study [19]. We chose a mixed methods approach to gain both breadth of the study by gathering multiple participant perspectives as well as deep insights from selected expert interviews [20]. Tashakkori and Creswell [89] distinguish four major types of mixed methods design: triangulation, embedded, explanatory, and exploratory design. In this paper we applied the sequential explanatory approach which means that qualitative data is used to explain and further elaborate quantitative results.

The quantitative data helped to identify the main challenges in work from home in general, as well as in communication, collaboration, management, and tooling in particular. The qualitative data from semi-structured interviews enabled us to elaborate on results from the quantitative analysis that needed further explanation and to compare them to known DSD challenges.

We connected the quantitative and qualitative phases when selecting participants for qualitative interviews and developing the interview protocol based on the results from the statistical test of the quantitative approach [20]. Our aim was to gain a deep understanding of challenges in work from home during the COVID-19 lockdown. The results of both quantitative and qualitative phases were integrated in the discussion of outcomes [20].

3.1.2 Target population and sampling. Using the explanatory mixed methods design involves first collecting and analyzing quantitative data and second using the results to inform the follow-up qualitative data collection. Thus, sampling occurs in two phases: the quantitative and the qualitative phase.

Our subject company for the quantitative phase was a small to medium-sized non-tech company specialized in consumer finance and liquidity management. We chose this company as neither DSD nor work from home was commonplace for the employees there before the crisis and we had good access to it. The bank counts about one million clients. Its business activities are carried out in Germany as well as in Austria by approximately 1,000 employees. The processes of the bank are highly automated and digitization plays an important role in the business strategy.

Preceding the COVID-19 pandemic, all software professionals worked together in one physical venue, there are no further development sites except one IT-service provider who worked off-site on Fridays; thus the employees had limited or no experience in DSD. However, around one third of the software professionals worked from home regularly (maximum once a week). Therefore, technologies like vpn or communication tools were in place and used for individuals working from home rather than the whole team.

The tools mainly applied for communication before the lockdown were Skype (for video conferencing and meetings) and Mattermost (for instant chatting). JIRA was used for collaboration and GitHub for development. A wiki, accessible to all employees, was used for documentation and knowledge-sharing. Most of the development teams were interdisciplinary and consisted of a Product Owner, a Scrum Master, Developers, Business Analysts and Testers. They mainly used agile development processes (predominantly Scrum).

To compare the challenges in work from home during the lockdown to the impediments experienced in DSD, the target population in this study were software professionals because their work was most comparable to people engaging in distributed software development. Additionally, our sample focused on the teams that started working remotely at full scale in the aftermath of the COVID-19 pandemic.

We chose only one company for the quantitative part of our study which allowed us to do an in-depth study on our research topic. In future investigations the sample can be extended to companies from other sectors and sizes as well as further types of organizations and different customer groups.

As recommended by Creswell and Plano Clark [20] for qualitative data collection, we took a smaller sample than for the quantitative data collection by gathering enough qualitative information to develop meaningful themes. The data was collected in fifteen in-depth semi-structured interviews. For sampling, we used the maximal variation sampling in which diverse individuals are chosen who are expected to hold different perspectives on the phenomenons under study [20]. Six interviewees were selected from employees who had completed the online survey because the individuals who can best explain the quantitative results are those who already participated in the quantitative part of the study [20]. In the second interview iteration we selected five more interviewees, one from a company that also started DSD due to the COVID-19 lockdown and four from companies that had experienced DSD before the COVID-19 crisis started. After this iteration we added four more interviewees working in large open source software projects or foundations who are used to work distributed all over the globe. Overall we interviewed fifteen people from ten companies in five different countries. In each iteration we adapted the interview protocol regarding findings of the previous iteration.

Table 1. Data sources of the qualitative study

Company ID	Interview ID	Expert Role	Branch	Country	DSD Experience
X1	Y1	Developer	Finance	Germany	Since COVID-19
X1	Y2	IT Coordinator	Finance	Germany	Since COVID-19
X1	Y3	Technical Product Owner	Finance	Germany	Since COVID-19
X1	Y13	Developer	Finance	Germany	Since COVID-19
X1	Y14	Developer	Finance	Germany	Since COVID-19
X1	Y15	Developer	Finance	Germany	Since COVID-19
X2	Y4	Developer	Technology	US	Since COVID-19
Х3	Y5	Developer (Co-Founder)	Technology	Spain	Many years
X4	Y6	<b>Technical Consultant</b>	Finance	Austria	Many years
X8	Y10	Developer	Education	Canada	Many years
X9	Y11	Developer	Technology	Germany	Many years
X5	Y7	Developer	Technology	US	Only DSD
X6	Y8	Developer	Technology	US	Only DSD
X7	Y9	Developer	Technology	Canada	Only DSD
X10	Y12	Developer	Technology	Germany	Only DSD

The sampling procedure was directed by the quantitative statistical results of the first phase and aimed at identifying individuals who can best explain the phenomenon of interest [20]. The data we collected is depicted in Table 1.

The participants in both the survey and the qualitative interviews took part on a voluntary basis.

#### 3.2 Quantitative study

3.2.1 Quantitative data collection. The methodology used for data collection in the first, quantitative phase was a cross-sectional survey [60]. For developing our survey we followed the method outlined by Kallus [50]. To calibrate the survey length, design, and questions we used existing surveys in related fields [27, 91, 93].

We divided our survey into 6 parts. The first part included general questions about work from home. After that in part 2 till 5 we asked about particular challenges in the fields of communication, collaboration, management, and tooling derived from reviewing related literature in DSD (see chapter 2). In the last part of the survey we asked questions regarding main challenges and opportunities, about the actual working environment and job satisfaction.

To adequately consider possible confounding factors [36] such as having children [41] or living at a subsistence level (that can impact work from home) [9], further challenges were included in the questionnaire in both a drop-down choices and open text fields. We used Likert scales as well as open text fields and dropdowns. Control questions were included to ensure proper answering [72].

To assess the influence on job satisfaction, we considered proven approaches such as the michigan organizational assessment questionnaire (MOAQ) [57] or the job satisfaction survey (JSS) [83]. As our focus was to identify the change of job satisfaction due to the shift to work from home while known approaches rather emphasis on job satisfaction in general, we decided to directly ask the participants whether their job satisfaction has improved through working from home during the COVID-19 lockdown. The participants had the option to rate this using a five point Likert scale from 0 (= strongly disagree) to 4 (= strongly agree).

The survey instrument was pre-tested on 6 selected participants. Based on the pre-test we slightly revised some survey items, especially minimized answer options and added examples and instructions. The survey was administered

 online and was accessed through a distributed URL. The data collection took place between May 12 and May 26, 2020. The survey was closed on May 30, 2020 (after four days without new incoming responses). To not be biased by the transition phase, because the survey took place only two month after the first lockdown, we sent the survey to the same target group again in August 2020. To not be biased by asking only one company, we additionally sent the survey to software professionals from other companies. The second data collection took place between August 24 and October 26, 2020. The survey was closed again after four days without new incoming responses.

Reliability and validity of the survey scales and items were established, analyzing frequency distributions and inter-item correlations (using the control questions for comparison) as well as internal consistency reliability indexes for each field of study namely communication, collaboration, management, and tooling [44, 86]. We used Cronbach's  $\alpha$  as a reliability index. According to Streiner [86] it was calculated as shown in formula 1.

$$\alpha = \frac{k}{k-1} * \left(1 - \frac{\Sigma \sigma_k^2}{\sigma_t^2}\right) \tag{1}$$

In the formula k stands for the number of items,  $\Sigma \sigma_k^2$  = the sum of variances of all of the items and  $\sigma_t^2$  = the variance of the total scores. The computation of Cronbach's  $\alpha$  can be found in the supplementary material. The complete overview of survey questions and corresponding answer options is enclosed in the appendix.

3.2.2 Quantitative data analysis. We used both univariate and multivariate statistical procedures to analyze the survey data. Demographic information was evaluated using frequency counts. We analyzed how different items correlated with each other using inter-item correlations. Thereby we focused on the question of how the experienced challenges correlated with job satisfaction.

An ordered logit analysis was conducted to identify the predictive power certain explaining variables have on the dependent variables following the procedure outlined by Cameron and Trivedi [15]. Generally, ordered logit models estimate relationships between ordinal variables to be explained and (other) explaining variables. Our survey included questions on the situation during the crisis that we were primarily interested in and that we defined as variables to be explained. Other questions referred to the situation before the pandemic or to unchanged organizational or personal contexts. We interpret these variables as explaining variables. The probability of a given outcome for the ordered logit model is:

$$Prob(a_i = j) = Prob(j - 1 < b_0 + b_1 x_i + u_i \le j = \frac{1}{exp(-\kappa_j + b_0 + b_1 X_i)} - \frac{1}{exp(-\kappa_(j - 1) + b_0 + b_1 X_i)}$$
(2)

The linear function:  $b_0 + b_1x_i + u_i$ , consists of the constant term  $b_0$ . The explaining variables are stacked together with further covariates in the column vector  $x_i = (x_i 1 \ x_i 2 \dots x_i k)$ . The corresponding coefficients are stacked in row vector  $b_1 = (\beta_1 1 \ \beta_1 2 \dots \beta_1 k)$ . The probability Prob  $(a_i = j)$  of the outcome  $j = 1, \dots, l$  corresponds to the probability that the estimated linear function, plus the logistically distributed error term,  $u_i$ , is within the range of the cutpoints  $\kappa_1$ ;  $\kappa_2$ ; ...;  $\kappa_l - 1$ . These are simultaneously estimated with the coefficients  $b_0$ ;  $\beta_1 1$ ;  $\beta_1 2$ ; ...;  $\beta_1 k$ . In our analysis  $\kappa_0$  goes to  $-\infty$  and  $\kappa_1$  to  $\infty$ .

Due to the non-linearity in the logit model structure, the model is estimated based on maximum likelihood. We tested our specification with a link test, described by Pregibon [68]. The test was based on the assumption that if a regression was correctly specified, there should be no additional explaining variable that was significant except by chance. What the test does is to refit the model based on the predicted and the squared predicted values of the model of Manuscript submitted to ACM

interest. In case of the significance of the squared predicted values the link test indicates that the model is not properly specified. In case of the significance of the predicted values and the insignificance of the squared predicted values our model would pass the link test. All ordered logit estimates can be found in the appendix.

Furthermore, we applied techniques of natural language processing to analyze the open text questions of the survey. The technological basis of our analysis was primarily built by the Natural Language Toolkit for Python [95] and the German-language Resource for Sentiment Analysis [74]. As part of our investigation we examined the frequencies of unigrams (single words) as well as bigrams (paired words). We further analyzed the association of the bigrams by calculating their pointwise mutual information [11, 46]. Finally, we performed a sentiment analysis using an algorithm that counts positive words of an answer, subtracts the sum of negative unigrams and divides the outcome by the word-count. As a result, we obtained a sentiment score between -1 and +1 for the observed answers.

#### 3.3 Qualitative Study

3.3.1 Qualitative data collection. In the qualitative phase of the study, we conducted fifteen follow-up semi structured interviews with experts from several companies and different countries aiming to reach internal and external validity and some "company-unrelated" narratives for the results of the quantitative survey.

The content for the interview protocol was based on the quantitative results from the first phase. The goal of the second, qualitative phase, was to explore and elaborate on the results from the statistical analysis that needed further explanations [20, 45]. The interview protocol can be found in the appendix.

3.3.2 Qualitative data analysis. We audio recorded and verbatim transcribed each interview [19]. The German interviews were translated. The transcripts were added to the QDA software for coding and exploration. For data analysis, we followed the constant comparative method [59] developed for the use in the grounded theory method of Glaser and Strauss [35]. Thus, we moved iteratively between codes and text to derive themes based on the concepts found from the quantitative data analysis.

In terms of the number of participants, in the sequential explanatory mixed methods approach the aim of the qualitative part is not to generalize from the sample (as in quantitative research) but to develop an in-depth understanding of a few people [20]. According to Fusch et al. [33] data saturation is reached when the study is replicable, further coding is no longer feasible and the ability to obtain additional new information has been attained. To ensure having reached data saturation we suggest that our study can be replicated using the interview protocol, we coded all parts of each interview and we conducted interviews until we did not identify any meaningful new themes from the answers. However, we do not claim our qualitative study to be generalizable as the objective of this part is to gain in-depth information about the central phenomenons.

The code system including definitions and number of codings per code can be found in the appendix.

After describing the data collection and approaches used for analyzing the data, in the following, we will explain our results from both the quantitative and the qualitative analysis.

## 4 RESULTS

## 4.1 Quantitative analysis

*4.1.1 Demographic information.* The survey was sent to all employees who were listed in the IT and infrastructure email distribution list of the company under study. This included 180 employees from four different departments namely

data analytics and reporting, IT infrastructure and support, conception and strategy and software development. From 180 potential participants, we got 64 complete answers (response rate of 35,6%).

The study participants were compared on the following demographic or general characteristics: role, division, proportion, and duration of work from home during and before the COVID-19 lockdown. Most of the respondents were employed in software development (50%) or in the data analytics and reporting division (27%). Participants worked mainly in the following roles: manager (34%), business analyst (19%), test and operation (15%), or developer (10%). All participants and their teams worked remotely at full scale during the COVID-19 lockdown starting in March 2020. Before the lockdown only 37% of the surveyed employees worked from home on a regular basis, which means once a week, 9% worked from home once a month, 36% irregularly, and 18% of the participants did not work from home at all.

4.1.2 Uni- and Multivariate Analysis. We found that while missing personal contact was rated as the main challenge (see figure 1), it did not directly correlate with the overall job satisfaction during the crisis (see figure 2). In contrast, adherence to work-life-balance, and coordination problems had a slight negative correlation to the working satisfaction (also see figure 2). Even if this correlation was not statistically significant we found it interesting and wanted to further analyze it using the qualitative follow-up interviews.

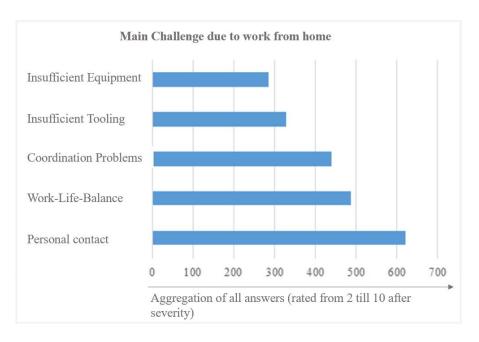


Fig. 1. Main Challenge due to work from home

We then analyzed selected responses with ordered logit models [15] and divided the results by their belonging to the four fields under study: communication, collaboration, management and tooling.

4.1.3 Communication. The ordered logit analysis showed that employees from the division of software development did not agree that communication in remote work was challenging or lead to misunderstandings. Quite to the contrary, they rated the communication as good, just like employees who characterized their teams as agile. Employees who Manuscript submitted to ACM

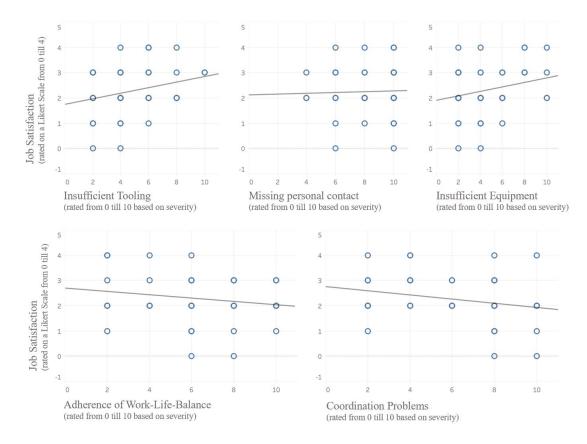


Fig. 2. Correlation of challenges (rated from 2 till 10 after severity) and Job Satisfaction (rated from 0 = not satisfied at all till 4 = more satisfied than before the crisis)

rated their team as process oriented did not agree that communication was exhausting while working from home. In contrast, employees from the conception and strategy division, who rated the communication as exhausting. Employees who classified their team as competitive and employees whose work strongly depended on others agreed at a higher rate that information was unequally distributed. Employees who classified their team as agile did not experience the issue of unequal distributed information.

4.1.4 Collaboration. Furthermore, we found that employees who classified their teams as collaborative agreed at a higher rate that effective work was possible while working from home and they were satisfied with the team collaboration. In contrast, employees whose work strongly depended on others were less satisfied with the collaboration in the team and tended to agree that effective work was not possible while working from home during the COVID-19 lockdown.

4.1.5 Management. In the ordered logit analysis we found that employees who classified their team as competitive agreed at a higher rate, that decision-making decelerated through the work from home during the crisis. Employees who characterized their team as agile and employees from teams, in which most of the members before the lockdown already worked from home on a regular basis did not feel an impact of the decision-making velocity. The latter and Manuscript submitted to ACM

Table 2. Most frequent unigrams (single words) mentioned as challenges in open-ended responses of the survey

German	English Translation	F
kommunikation	communication	13
person	personal	7
kontakt	contact	7
arbeit	work	7
abstimm	coordination	6
	kommunikation person kontakt arbeit	kommunikation communication person personal kontakt contact arbeit work

Table 3. Most frequent bigrams (paired words) mentioned as challenges in open-ended responses of the survey

R	German	English Translation	F	PMI
1	person, kontakt	personal, contact	5	4.22

members of teams classified as collaborative did not feel a negative impact on planning during their remote work. This is equally true for employees in the software development and conception and strategy divisions. In contrast, employees whose work strongly depend on others agreed at a higher rate that the remote work during the crisis impeded proper planning. Furthermore, we found that employees who classified their team as collaborative agreed that their overall working situation improved through the work from home during the COVID-19 lockdown.

4.1.6 Tooling. In the ordered logit analysis we found that employees in whose teams no new tools were introduced consented that communication is challenging. We also found that employees who characterized their team as competitive were significantly less satisfied with the provided tools than employees who classified their team as collaborative or process oriented. As we found this result very interesting, we wanted to further elaborate this through emphasizing it in the follow-up interviews.

4.1.7 Analysis of Open-Ended Responses. We asked the participants of the survey in an open question to describe their main challenge while working from home due to the COVID-19 lockdown to avoid neglecting confounding factors which means factors that are perceived as main challenges but that are not addressed in our survey. Furthermore, we invited participants to explain why their working satisfaction increased or decreased, to further elaborate the aspects that mainly influenced their job satisfaction.

In the open-ended responses to the question regarding the main challenge of remote work the most frequently mentioned unigrams (at least 5 occurrences) are listed in table 2.

The analysis of the unigrams gave a good impression of the problems that occured with work from home in the bank, which primarily concerned social aspects such as communication, coordination, and personal contact. This is confirmed by the most frequently mentioned bigrams (at least 3 occurrences) in table 3.

Five participants mentioned that a lack of personal contact was the main challenge when working from home.

We finally asked the participants if their job satisfaction has improved through the shift to work from home during the crisis. In addition to this question we provided a free text field to explain their choice. Figure 3 shows the distribution of the calculated sentiment score for these given explanations.

The results of the sentiment analysis confirmed our previous findings. Overall, the score reflects a positive sentiment among the explanations (mean=0.08, median=0.023, standard deviation=0.14). The score is positive for 20, neutral for 13, Manuscript submitted to ACM

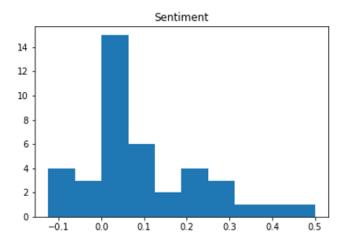


Fig. 3. Sentiment Analysis for the explanations of survey participants if their job satisfaction improved through the shift to work from home

Table 4. Most frequent unigrams (single words) mentioned as explanation why job satisfaction decreased / increased through the shift to work from home

R	German	English Translation	F
1	arbeit	work	29
2	mehr	more	17
3	arbeitsweg	commute to work	9
4	flexibel	flexible	8
5	moglich	possible	7
5	tag	day	7
6	zeit	time	5
6	arbeitszeit	working hours	5
6	termin	appointment	5
6	schwierig	difficult	5
6	konzentriert	concentrated	5
6	homeoffic	home office	5
6	kolleg	colleague	5

and negative for 7 answers. Some respondents did not explain their choices. The most frequently mentioned unigrams (at least 5 occurrences) are listed in table 4.

We found the terms "work" (29), "flexible" (8), and "concentrated" (5) in the explanations. In addition, the unigrams "commute to work" (9), "working hours" (5), "day" (5), "time" (5), and "colleague" (5) occur in several answers. These can be connected to the most frequently mentioned bigrams in table 5.

On one hand, due to the remote work, the participants could better concentrate on fulfilling their tasks. Furthermore, they had more time at their disposal, as they did not have to commute to their workplace and were more flexible in planning their tasks. On the other hand, they missed their colleagues and the social interaction.

Table 5. Most frequent bigrams (paired words) mentioned as explanation why job satisfaction decreased / increased through the shift to work from home

R	German	English Translation	F	PMI
1	konzentriert, arbeit	concentrated, work	5	4.20
2	mehr, zeit	more, time	4	4.65
3	kolleg, fehlt	colleague, missing	3	6.74

To not be biased neither by the transition phase nor by asking only one company, we sent the survey at a later time to a larger target group. There, we got 101 complete answers. Comparing the ordered logit models mainly confirmed the results drawn from the first survey. We found that the positive effect of working in collaborative teams are equal in the ordered logit models. Comparing the ordered logit models also confirmed the negative effects of working in a competitive team or having a very tightly coupled work e.g. in conception or strategy. Also the negative effects of depending from colleagues could be reassured. In contrast to the first ordered logit model, in the second one we did not find any negative effects because of the urge to work at certain core working hours. In contrast, we found that participants who feel the need to work at certain core working hours tend to rate the communication as good.

To sum it up, the sentiment analysis revealed that the participants were rather satisfied with their actual working situation. Missing personal contact turned out to be the main communication challenge derived from both the univariate analysis and the analysis of open ended answers. Furthermore, we identified that mainly employees working in the conception and strategy division perceived remote communication as exhausting. We also found that employees in competitive teams or those whose work strongly depend on others are mainly affected by the shift to work from home. The communication challenge of unequally distributed information was perceived by employees working in a competitive team or by employees highly depending on colleagues. The latter also were less satisfied with the inner team collaboration, general planning, and the work effectiveness. Employees in competitive teams agreed at a higher rate, that decision-making decelerated and they were less satisfied with provided tools.

Furthermore, it seemed like missing personal contact did not directly correlate with job satisfaction, while adherence to work-life-balance and coordination problems had a slight negative impact on job satisfaction. As described above, we wanted to further analyze some of the results in the follow-up interviews.

#### 4.2 Qualitative Phase

 The interviews were held with the aim to better understand and further elaborate results from the quantitative phase explained in the previous section. Data analysis of the qualitative follow-up interviews enabled us to identify, codify, and categorize the key challenges employees had to face through the (newly introduced) work from home and their impact on job satisfaction. Through the interviews with employees who had worked distributed before the COVID-19 pandemic, we could compare and contrast the identified challenges. The final codebook included 12 code categories and 57 codes. In summary, we derived more than 500 coding segments, some of which we present in this section. The complete codebook can be found in the appendix.

From the quantitative analysis we derived remote communication especially missing personal contact as the main challenge. Moreover, employees who highly depend on colleagues tended to be less satisfied with remote collaboration. To further elaborate on this, in the interviews, we asked for main challenges of working from home, detailed explanations, and examples.

 From the univariate analysis, we found that missing personal contact did not correlate with job satisfaction. On the other hand, adherence to work-life-balance and coordination problems led to decreased employee satisfaction. Thus, we asked interviewees which challenges mainly affect their job satisfaction.

From the multivariate analysis we found that employees from teams characterized as competitive were less satisfied with the decision-making processes, with tools, and with communication in their teams while working from home during the COVID-19 lockdown. As opposed to employees working in teams characterized as collaborative who were rather satisfied with their tools and who even tended to rate their job satisfaction during the COVID-19 lockdown as higher than before the crisis. To gain a broader understanding on this topic we asked the interviewees how team characteristics and collaboration modes impact their working satisfaction. In the following we present the results from the interviews.

4.2.1 Main challenges while working from home. We divided the challenges mentioned during the interviews into challenges related to communication, collaboration, management, tooling, and others. With 85 code segments, challenges in communication were referred to most often. The most frequently mentioned communication challenges were missing personal contact (35 coding segments), accessibility and finding the right balance between synchronous and asynchronous communication (18 coding segments) as well as technical issues (10 coding segments).

Communication was referred to as main challenge while working from home from one of the interviewees who also took part in the quantitative survey as follows:

"The biggest challenges... well, I think we work in teams overall, so I don't think there's anybody in the bank who's really working on his own. And when you work together with someone, communication is naturally part of it, no. So communication has to work. If it doesn't work, then you can't do your work, or at least for me, I can't do my work properly." [Interview Y3]

Within the communication part, interviewees often addressed the challenge of missing personal contact and direct interaction especially within their teams:

"The biggest challenge related to work. Let's think for a second, [...] When you see people, you meet people. I think that's what people miss at home. I can imagine that through the absence of social contacts you get in a depressive mood." [Interview Y13]

or "Because it's just fun to talk, or just to have a coffee, or just to exchange what happened this week. And that's what I think, you can not do it [...] for example via Skype or something like that, it just doesn't really work." [Interview Y1]

Also participants who are used to work from home stated the importance of personal contact:

"[...] it's still very important that you've actually meet your colleagues in person because you really get an idea of a personality much better like that. You can then use that knowledge online." [Interview Y9]

An interesting fact about missing personal contact was that this was especially addressed as the main challenge by software professionals who had to shift to work from home because of the COVID-19 pandemic. Some of the more

experienced distributed workers did not mention missing personal contact as a challenge neither before nor during the pandemic.

 Possible reasons for this could be that they are used to work distributed or found adequate substitutes for personal contact. Directly asked if and how they replace personal contact we received a wide range of answers from measures like installing remote coffee breaks and organizing virtual conferences up to interviewees stating that they do not need intense personal contact. For that we found two reasons, first was that colleagues (also asynchronously) communicated about their mental wellbeing:

"I find seeing each other helps, of course, but I find, actually, it's more important for me to know where the other person is mentally." [Interview Y8]

and second, more frequently addressed, reason was that the software professionals took their sense of belonging from other aspects like the company culture or from working towards a shared vision like stated in the following answers:

"We have this philosophy that we act as a family. It's like a circle of friends. There's actually this feeling and that's also required of everybody, that everybody belongs. And that everyone is part of [...] the family and also of the group and is treated accordingly." [Interview Y7]

or "I think it's because the identification with what we do is very high. [...] That's where everybody kind of takes pride in working for the team and feels comfortable with the team and feels that the product, the open source product, is great and everyone is proud to be a part of that." [Interview Y11]

This is an interesting finding as it seems like personal contact becomes less important over time and if the company installs a familiar culture including a shared vision in which employees could exchange about their mental wellbeing. This could also happen asynchronously. Nevertheless, also more experienced DSD workers mentioned the challenge of missing personal contact, especially when it comes to networking and integration:

"Especially as a remote worker, it's difficult or important also to make new contacts in just a big company. And of course that's hard to do when I'm in such a remote meeting. So even if it's a larger meeting, I'm only a small window on the screen. [...] so without personal contact I have not yet found a good way to get it right." [Interview Y7]

Remote Meetings are a good starting point to discuss the second most addressed challenge within communication, namely "how to find the right balance between synchronous and asynchronous communication?" Asynchronous communication is a best practice often referred to in the interviews to not depend on reaching colleagues or being reachable all time. However, the interviewees who also took part in the quantitative survey did not significantly increase their proportion of asynchronous communication and also some of the interviewees who already gained some years of experience in work from home stated that this is not the solution for everything:

"Of course, this asynchronous teamwork is very important. So that must be emphasized tremendously, because otherwise it's useless if I just sit at the screen and talk on the phone all day. [...] So it was an adjustment for me then when I went into this remote work from 2013. And in fact, I have also noticed over the years that this asynchronous communication does not Manuscript submitted to ACM

work perfectly with everyone..." [Interview Y7]

Also another interviewee who already worked in a distributed team before the COVID-19 pandemic explained that in his team synchronous is preferred over asynchronous communication:

"[...] We don't have core working hours. So I maintain we have a very modern approach. If you want to sleep in today because you don't feel well. Then just work longer in the evening. I don't care. Actually, so if it's not every day now. But of course it makes it easier and it is basically expected that you are more or less available. In a core working time that is not defined [...]." [Interview Y6]

Thus, it seems like the urge to be reachable, at least between certain periods, to enable synchronous communication is also present in companies that are more experienced in DSD. Nevertheless, interviewees explained that they introduced measures to avoid having meetings and having to talk on the phone all day, which is a threat of synchronous communication. One interviewee for example described the concept of "no interruption Thursdays.." [Interview Y7] which means they don't have any meetings at all on Thursdays.

Communication is closely linked with collaboration. We assigned 38 Code segments to challenges related to collaboration which makes the second largest part after communication. Challenges related to management were mentioned 15 times, and 14 code segments were assigned to challenges related to tooling. Regarding challenges that are not assigned to one of the four categories the challenges that are referred to the most often were adherence of work-life balance (16 coding segments) and missing office and equipment (12 coding segments).

4.2.2 Impacts of challenges on work satisfaction. When we asked which challenge had the greatest negative impact on job satisfaction the challenges most often referred to were technical issues (9 coding segments) and missing personal contact (7 coding segments).

Technical issues were mentioned as impediments to productive work and also resulted in a decrease of job satisfaction. We derived this from comments like:

[...] I always have a loss of productivity when communication is disturbed, i.e. when the software is disturbed..." [Interview Y3]

or "If for example systems or something like that failed, [...] of course you got upset for a short time because you just wanted to continue with your topics." [Interview Y1]

"It is difficult when things don't work. I was relatively new at the bank and then there were problems with the general access and then you have to find out if it's just me or if no one can get in..." [Interview Y14]

"I don't remember exactly what it was, but every now and then I had to go there with the device and have them fix it. Of course, that's rather inconvenient. [...] That is just annoying of course because afterwards you have to make up for the lost time." [Interview Y15]

Despite the quantitative result, we found that missing personal contact had a negative impact on job satisfaction as expressed e.g. in the following statement:

"Then, I think, not only for me but also for others there was a certain low point, if you want to call it like that, a kind of camp fever. You don't see your colleagues anymore, [...] you don't meet at the coffee machine any more, sometimes in between, that's just what was missing, of course." [Interview Y3]

or "So from my point of view what I'm missing are the specific human encounters in real life. And I miss the inspiration and the energy that you get from that." [Interview Y12]

Other aspects that were mentioned as a reply to the question which challenges impact the work satisfaction the most were challenges regarding the level of dependence on colleagues and missing work-life balance (both with 4 coding segments). As expected, more experienced DSD workers did not emphasize technical issues. Instead, they referred to a general uneasiness or anxiety because of the pandemic or to challenges like home schooling and child care:

"We also had people very early on who could no longer cope at all, especially with childcare." [Interview Y6]

In contrast to the quantitative results none of the interviewees mentioned coordination problems as reason for decreased satisfaction.

We also found that not only work from home challenges but also team characteristics and working modes influenced the satisfaction of employees and thus will further explain this in the following paragraph.

4.2.3 Impacts of team characteristics on job satisfaction. We analyzed why employees from collaborative and competitive teams experienced different impacts on their job satisfaction through changing to work from home. Therefore, we tried to find out how team characteristics and collaboration modes impacted the work satisfaction of the interviewees. None of the interviewees described their own work setting as competitive. Many interviewees explicitly mentioned their gratitude working in a collaborative team:

"[...] you really work together, you actually see the team concept, the team spirit, the cooperation works well and you don't try to work against each other [...]." [Interview Y3]

or "if you have a problem, to support the other person remotely." and that "if you have to go away for a moment or to the doctor, and the other person says: Yes, that's no problem. So if something happens, then he's definitely there too." [Interview Y1]

To further investigate this topic, we asked interviewees who are experienced in distributed work which team characteristics or working modes are most important for work from home. From the answers we derived that working modes (e.g. following certain processes or using an agile development approach) are less important for work satisfaction in distributed teams than having a high level of trust and a common goal (12 code segments) and the ability to act self responsible (10 code segments). The experienced DSD workers for example explained:

"So right at the top is trust [...] And that's really top down in every area of work. That's so with every decision that every developer makes, that's always in the back of their mind. [...] And the basis for that is really trust. The moment I can no longer trust my boss or I can no longer trust my colleagues, then the situation probably wouldn't be the way it is now." [Interview Y7]

or "Having a common goal, feeling that the other person is competent and is also trying their best towards that goal. It definitely makes you feel connected. Like, you know, I do research collaborations with people in other countries, some of whom I've never met in person and I feel connected because we have this common interest and I trust that they are doing their work. And I'm doing mine and. Seeing them every day would just add nothing for me." [Interview Y10]

or "I don't necessarily have the feeling that I've lost so much personal contact. And that's one of the experiences I've had in the open source communities is that I can work excellently with people, for years, without even knowing what they look like and build an excellent relationship. [...] That is perhaps because in the open source community most people are there out of personal motivation, because from the beginning there was such a common community feeling or common values also such a common spirit was there." [Interview Y12]

Trust builds on self-responsibility of employees, which was addressed as follows:

"So you have to take a lot of responsibility for yourself." [Interview Y8]

or: "[...] the developers are very independent at our company." [Interview Y7]

This shows that even if an agile development approach is beneficial for work from home, there are team characteristics that seem to be more important like trust, a common goal, and self-responsibility.

To sum it up, we could generate a better causal understanding from the qualitative research after identifying quantitative correlations. With this in-depth knowledge, some results of the quantitative analysis could be reinforced, others could not be confirmed. The qualitative data confirmed the main challenges found in the quantitative data namely communication issues (personal and technical) and missing personal contact among software professionals. On the contrary, more experienced DSD workers did not mention missing personal contact, at least not as the main challenge. Also finding the right balance between synchronous and asynchronous communication was addressed as a challenge frequently.

In contrast to the quantitative data analysis that revealed coordination problems as having a negative impact on work satisfaction, the aspects mentioned to this question most often included missing personal contact, technical issues and depending on colleagues. The negative impact from missing work-life-balance on work satisfaction was confirmed by the follow-up interviews. The qualitative data could not reaffirm dissatisfaction in competitive teams but confirmed that employees working in collaborative teams are rather satisfied with the work from home situation. Furthermore, employees experienced in distributed work recommended to let employees act self-responsible and to build up a community of trust.

#### 5 DISCUSSION

The goal of this study was to identify the key challenges software professionals experienced throughout the rapid and unexpected change to work from home during the COVID-19 lockdown and how these challenges impacted their work

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satisfaction. Furthermore, we wanted to compare and contrast the challenges to known challenges in DSD. In both our quantitative and the qualitative analyses we found that there was a broad acceptance of work from home at the case company under study and in the surveyed companies. After systematically surveying DSD literature in the context of our research questions we found that challenges mainly can be categorized in the following categories: communication [1, 29, 62, 63, 94, 98], collaboration [34, 71, 94], management [24, 29, 54], and tooling [5, 31, 103]. As follows, we discuss each category in detail, discussing the implications of our findings, as well as drawing parallels with the recent DSD and COVID-19-related literature. Broadly this discussion will serve as the basis for a future study, where we plan to address the identified work from home challenges through industry best practices observed in hands-on case studies to follow.

#### 5.1 Communication

 A challenge in communication is finding the right balance between synchronous and asynchronous communication. We found that employees in the company under study depended on synchronous communication. Also more experienced remote workers still partly preferred synchronous communication, while existing literature recommends fostering asynchronous communication. We also found that the conception and strategy division was the only division that rated distributed communication as exhausting. Hence, we assume that employees working on tightly coupled and complex non routine tasks which necessitates frequent, mainly synchronous communication are less satisfied with distributed communication. Thus, synchronous communication while working from home seems to be necessary and exhausting at the same time.

In addition, people faced challenges in remote communication of both personal and technical nature which led to decreased work satisfaction. In general, the topic of personal communication challenges is broadly addressed in DSD and we think that many best practices generated there (focus on public, easily accessible communication, using appropriate communication tools, etc.) can be applied to improve remote communication for software professionals who had to switch to work from home due to COVID-19. Despite the known personal communication challenges and best practices in DSD, our novel finding was the emergence of technical issues. This was mainly caused by the lacking employee knowledge and technical infrastructure that needed to be adapted.

Furthermore, we found that missing personal contact, as an aspect of communication, is one of the main challenges perceived by the participants and also led to a decrease in work satisfaction. This is in line with the finding that virtual communication has its limitations, is a hindrance relative to face-to-face interaction and increases work stress [23, 98]. Frequently discussed recommendations in DSD literature to overcome this challenge indicate a necessity of investments in travelling and socialization because it seems like real personal contact is not replaceable by any virtual measure [62]. However, in the qualitative interviews we found that personal contact seems to become less important if the company has a common culture, employees are working together on one shared vision, and can talk about their mental state with their colleagues (even if this happens asynchronously). As this is an interesting finding this topic should be further analyzed.

In sum, there are some new challenges in the field of communication (missing personal contact, higher impact of technical communication issues and finding the right balance between synchronous vs. asynchronous communication). These results matter because they directly impact work satisfaction and thus need to be addressed in order to generate positive workplace outcomes. In our study, we did not find an adequate substitute for personal contact but it seems like the negative impact on work satisfaction could be reduced by taking the right measures regarding the company's culture and vision.

 Thus, for research we recommend to further analyze how to adequately replace personal contact, as this situation might take some more time and missing personal contact seems to be one of the main challenges due to the enforced work from home. Also finding the right balance between synchronous vs asynchronous communication needs to be further studied.

In practice we recommend companies to offer training in remote communication and to set up a technical support hotline to overcome technical communication issues. Regarding missing personal contact, possible improvements might be e.g., having virtual coffee breaks or discussion rounds using video calls to give employees the possibility to see each other and a space to talk about private matters. Furthermore, the negative impact of missing personal contact on work satisfaction could be reduced by taking the right long-term measures such as focusing on a culture of trust and creating a common vision.

#### 5.2 Collaboration

In the field of collaboration we identified *depending on colleagues* as well as *the urge to be reachable between core working times* as main challenges. We also found that working in a competitive team negatively impacts the work satisfaction in general and the satisfaction with team collaboration in particular. This supported findings from former studies that identified agile and collaborative working modes as beneficial for successful DSD [37, 42]. Also Krzywdzinski et al. [56] found in their study based on an online survey of 1,516 individuals who worked from home during the COVID-19 pandemic that the quality of team collaboration and team productivity slightly increased in agile teams. From the qualitative interviews we found that the most important team characteristics in distributed teams are trust and self-responsibility.

The collaboration challenges found in the study (urge to be reachable, depending on colleagues and negative impact of competitive working mode) is studied in recent research. Nevertheless, results matter because right now we have a different type of distributed collaboration. We do not have collaboration between multi sites of a company (as often addressed in former DSD research) and neither single employees who are working from home (which was the usual case in work from home studies). Instead, we have entirely distributed collaboration where everyone is working from a different place namely from home. Thus, it was important to reassess the challenges under this situation of distributed collaboration.

A limitation is, that we cannot foresee if and how the challenges will change, when it comes to a more hybrid type of collaboration when some employees return to the office and some remain at home, as could be a possible future scenario.

As challenges identified in this study are known and thus extensively studied in existing literature. In practice we recommend applying existing best practices as, e.g., to focus on agile and collaborative working modes with defined and clear processes that foster on asynchronous collaboration. Furthermore, we recommend fostering a culture of trust and self-responsibility.

## 5.3 Management

In our study we found that depending on certain decision-makers has a negative impact on planning and that working in a competitive environment seems to slow down the decision-making process. This means that management should foster collaborative team settings, transfer responsibility and decision-making power to the teams, and set up an environment of trust. This point of view was supported by experienced DSD workers as well as by recent work from

home literature. For example Wang et al. [98] found that employees with higher levels of job autonomy have higher levels of performance and well-being during the period of work from home.

The working mode described above is well established in larger open source projects and foundations thanks to clearly defined and efficient governance structures [55]. While one important goal of open source project governance is to ensure continuity and to integrate the competing forks [51, 55], we found that companies do not have to deal with this issue because of the often top-down management, which dictates what software needs to be developed. However, we found that companies can learn from the other DSD best practices of open source communities, especially when it comes to the management in order to foster collaboration and asynchronous decision-making.

In the category of management we focused on decision-making, planning, and team setting. This narrow scope was by design, as we didn't want to gather general data on the large topic of DSD management, instead we predefined the focus based on our preliminary literature review. At the same time, this can be seen as a limitation of the study, as DSD management is a broad field in which many other aspects could be addressed and analyzed.

While our research supported some findings by peer researchers as presented above, we also identified some dissimilarities between our findings and related literature. Namely, when it comes to global software development, a key challenge is associated with software process improvement [24, 54]. We recognized this challenge from the literature, however, in our study we didn't systematically identify software process improvement as a key challenges our study participants addressed. One reason for this could be the specific context of our study focused on the COVID-19 pandemic period during which the focus was generally less on process improvements across the board, but more on keeping things running and managing the forced transition to work from home. In a future study, we will consider asking about this topic especially to software developer interviewees in order to validate this suggestion from the literature, as well as to potentially identify some best practices that emerged to address software process improvement in the context of DSD.

## 5.4 Tooling

 Our findings suggest that employing the right tools in companies that were forced to work remotely due to COVID-19 foster intraorganizational collaboration, knowledge transfer, development, and communication. However, we also found that choosing and implementing such tools can be a challenge for companies as seen in our data. This topic is addressed in DSD literature broadly [5] and also mentioned in other literature in the specific context of the COVID-19 pandemic [103]. Interestingly, our study found that tooling was a major challenge for companies forced to work from home during the COVID-19 pandemic, even though some other researchers found tooling, especially collaboration tooling to be less of a challenge in a similar transition [31]. In particular in their recent 2021 TOSEM article on software developers working from home during the COVID-19 pandemic, Ford et al. find that friction with collaboration tools was rated by their study participants as the least frequently mentioned major challenge (selected by only 22% of their study participants). In our study, on the contrary, we identify both collaboration and tooling as two major areas that our study participants struggled with during the sudden transition to work from home. This is supported by Ferreira et al. [29] who also identified finding the best work from home tools among the top 5 challenges within their interviews.

While tooling was considered essential by most employees, we also found that participants who rated their team as competitive were less satisfied with provided tools. In our study, we could not find out why this is the case. The question why and how competitive working modes influence the satisfaction with provided tools should be further analyzed. In our follow-up studies, we plan to expand on this insight and search for corporate best practices that emerged in

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competitive teams to address the issue of inadequate tooling software developers and other employees used while working from home.

Finally, we want to echo the proposition of Smite et al. that the forced work from home, while challenging, can actually result in a widely accepted work from anywhere in the long-run [80]. Such an approach to telework coupled with the acknowledgment and resolution of key challenges presented in this paper can result in more scalable organizations that are able to seize the benefits of DSD environments to a higher extent. Further studies on these long-term effects remain within our research outlook.

#### **6 LIMITATIONS**

#### 6.1 External validity

A limitation of this study is the sample size of one company and fifteen qualitative interviews though analyzed in depth. The company was carefully selected and the focus on one company enabled applying the mixed methods approach via both survey and qualitative interviews soon after the first COVID-19 lockdown. Nevertheless, we do not claim results of this study as generalizable to other companies and further research on this is required.

Furthermore, our response rate did not cover all software professionals of the selected company. Thus, our results could be biased because only certain employees answered (e.g. employees who have a positive attitude towards working from home). Even so, we assess the participants to be a good representation of the company as we got results from all four departments including different roles and a wide variance in responses.

Several respondents have already experienced work from home, and there are certain tools/procedures established to at least partially assist such work practice in the company under study. Thus, one could claim that this population does not represent a proper population for studying forced shift to work from home. Nevertheless, the COVID-19 crisis poses new challenges because of the enforced, unplanned work from home of all employees. This is a novel situation for every software professional in the company under study but might become the new norm.

The quantitative survey was conducted in May and in August 2020 during the first COVID-19 lockdown. As the situation is changing fast and the further development of the crisis can not be foreseen, answers might change over time and need to be re-recorded in further studies at a later time.

#### 6.2 Internal validity

To infer causality, we must demonstrate correlation, precedence and the absence of third variable explanations. Other confounding variables influencing the satisfaction with the actual work from home situation might include individual differences (e.g. personality), having children, and many others. It is very difficult to exclude all other factors. Thus, we decided to offer open questions where participants had the option to describe challenges that were not emphasized in the questionnaire and analyzed these via natural language processing. Therefore, we also received answers including challenges like homeschooling or inappropriate working conditions at home but as a whole open answers supported the results drawn from the ordered logit model. Nevertheless, further challenges can be used to extend our model in subsequent research.

## 6.3 Conclusion validity

Confirmability, the degree to which the authors are neutral towards the inquiry and their potential bias effect on the findings, is another potential limitation. Qualitative data research realized by only one researcher has inherent

subjectivity and bias. In our case we were an interdisciplinary team from different fields of research and industry. This helped to incorporate different points of view in our study. Moreover, the measurement instruments were tested to ensure reliable measurements.

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#### 7 CONCLUSION

In this study, we analyzed challenges of the unplanned switch from working in companies to working from home for software professionals in a medium-sized non-tech company. We also compared and contrasted these challenges to already documented ones in DSD and work from home literature to find where existing practices can be applied and for which fields further research is required.

In our study, we found that the identified work from home challenges can be mainly categorized into the following topical groups: communication, collaboration, management, and tooling.

In the field of communication, we found some challenges that differ from those identified in existing research. These are missing personal contact, higher impact of technical communication issues and finding the right balance between synchronous vs. asynchronous communication. Previous DSD research recommends fostering real personal meetings to overcome the challenge of missing regular personal contact. This is not possible in the current situation and thus adequate substitutes need to be found. A possible measure could be fostering a common culture and a shared vision which seems to reduce the negative effects of missing personal contact. Technical communication issues can be mainly derived from work from home as a new situation for both employees and companies. Thus, we recommend providing a help-hotline and focus on adequate infrastructure. DSD research and most experienced remote workers mainly recommend asynchronous communication, while at the company under study synchronous communication is seen as necessary on the one hand but also as exhausting on the other hand, especially at fulfilling tightly coupled work including highly complex, non-routine tasks. Thus finding the right balance between synchronous and asynchronous communication still needs to be analyzed.

In the field of collaboration, we identified the dependence on colleagues as well as the urge to be reachable between core working times as main challenges. We also found that working in a competitive team negatively impacts the satisfaction with team collaboration. We found that most experienced remote workers recommend to emphasize on trust and self-responsibility in teams. That agile working modes are beneficial for DSD is addressed in existing literature but needs to be reassessed for the actual situation in which everyone is working from a different place namely from home.

In the field of management, the challenge of decelerated decision-making processes due to working from home was only perceived by employees who rated their team as competitive. Participants who highly depend on others rather agreed that no proper planning was possible due to the enforced work from home. This is in line with the recommendation of DSD experts who recommend that management should foster collaborative team settings, transfer responsibility and decision-making power to the teams, and set up an environment of trust. In contrast to existing DSD literature, software process improvement was not identified as key challenge in our study.

The main challenge regarding the usage of tools was finding appropriate tools supporting collaboration and knowledge transfer. We further found that employees working in a competitive team are significantly less satisfied with provided tools. The question why and how competitive working modes influence the satisfaction with provided tools should be further analyzed. Even though some other researchers found tooling, especially collaboration tooling to be less of a challenge, in our study we identify both collaboration and tooling as two major challenges.

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When trying to improve the quality of work from home, one should address the negative aspects. Thus, further research on this topic can focus on how to best deal with the missing personal contact and how to improve remote communication, especially finding the right balance between synchronous and asynchronous communication. Moreover, the aspect of competitive vs. collaborative teams and whether collaborative teams deal better with unforeseen situations like the COVID-19 lockdowns should be addressed in further research.

Potential remedies for companies being forced to switch to work from home are to offer appropriate training and technical support. Beyond that, we advise to focus on compensation for missing personal contact by providing social offers like open virtual coffee breaks or discussion rounds and to foster this through appropriate tooling. Moreover, agile, collaborative working modes seem to be beneficial as well as having a common culture and working on a shared vision. However, no single action appears appropriate to everyone, hence organizations should steadily communicate with their employees to keep their job satisfaction as high as possible and the needs of employees should be reassessed over time, as the situation is steadily changing.

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A APPENDICES

A.1 Survey questions and answer options

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Due to the current situation, triggered by the corona pandemic, an above-average number of people work from home (remote work). Remote work is perceived very differently. This survey is about your personal experiences with remote work.

There are no prizes to be won for answering, but we donate € 1 for each survey answered to a selected Corona aid project.

Of course, your data will be treated confidentially and only processed for scientific purposes.

No personal data is collected in the survey.

We would be happy to inform you about the evaluation of the survey. To do this, you can enter your email address at the end or contact us directly.

It takes about 15 minutes to complete.

Thanks for your support!

#### First a few general questions about remote work

Q1. How often do you currently work remotely (i.e. from home)?

Answer Options

not at all

irregular 1-2 times a week

3-4 times a week

I only work remotely

Other (please specify)

## Q2. Does your entire team work remotely for the most part (more than 2 days a week)?

Answer Ontion

yes

no

Other (please specify)

#### Q3. How often did you work remotely before the Corona crisis?

Answer Options

not at all irregular

monthly weekly

every day

#### Q4. Please sort the following challenges that arise due to remote work according to your personal weighting.

To do this, drag the options with the mouse to the appropriate place, starting with the greatest challenge (1 = very stressful, 6 = not very stressful).

Answer Options

Coordination difficulties in the team

Balance between work and private life

Lack of personal contact with colleagues Insufficient tools (e.g. for video telephony)

Inadequate equipment (e.g. screen, microphone)

Technical problems (e.g. when establishing a connection or when using tools and communication media)

## Q5. How much do you agree with the statement: The current remote work prevents effective work in my team.

Answer Options

strongly disagree

disagree neutral

agree

strongly agree

#### Next, some questions about the decision-making process in your team

## Q6. How are decisions currently predominantly made in your team? Please choose one option.

Democratic in the team

The boss decides

By coordinating with stakeholders

Guidelines from the company

According to company vision and mission

No decisions are made in the team

Other (please specify)

#### Q7. How much do you agree with the statement: Because of the remote work, decisions are postponed.

Answer Option

strongly disagree

disagree neutral

agree

agree strongly agree

## Q8. If decisions are postponed: What kind of decisions are postponed due to the crisis?

You can choose several options.

Answer Options

strategic (e.g. alignment, new projects) operational (e.g. prioritization of topics) personnel (e.g. salary increases) no decisions are postponed Other (olease specify)

#### Q9. How much do you agree with the statement: The decision-making process has slowed down due to the remote work.

Answer Options

strongly disagree disagree neutral agree

Q10. How much do you agree with the statement: Remote work impairs stable planning and prioritization of topics within the team.

Answer Options

## And now some questions about the tools you use

Q20. Were new tools introduced for remote work during the crisis (e.g. Skype, Zoom, Miro ...)? Answer Options

yes

strongly disagree

If so, which tools have been introduced?

Q27. Which Corona aid project should be donated to?

Ärzte der Welt (Doctors of the world) SOS-Kinderdörfer (SOS Children's Villages)

Aktionsbündnis Katastrophenhilfe (Action Alliance for Disaster Relief)

## Q21. How satisfied are you with the tools currently in use? Answer Options Part 5: Tooling not satisfied at all rather not satisfied neutral rather satisfied extremely satisfied And finally, questions about you and your work environment Q22. Which of the following best describes your role? Answer Options Developer / DevOps Product / UX - Designer Project Manager / Produkt Owner Expert for Quality / Test Scrum Master Architect Other (please specify) Q23. In which department are you working? Answer Options IT- / Software Development Data Analytics / Reporting IT Infrastrukcure / Support Conception / Strategy Other (please specify) Q24. Please write down what, in your opinion, is the greatest challenge and the greatest opportunity of remote work. Personal questions and working environment **Answer Options** Challenge (Text field for open answer) Opportunity (Text field for open answer) Q25. How much do you agree with the statement: Working remotely has improved my job satisfaction. strongly disagree disagree neutral strongly agree Please briefly describe why your situation has improved / worsened: (Text field for open answer) Q26. Yes, I would like to receive the results of the survey at the following email address. Email addres (optional):

Answer Options

## A.2 Questions of qualitative interviews

## Questions for semi structured interviews

## General Situation / Employee satisfaction

- 1. How did the COIVD-19 pandemic affect your work?
- 2. How satisfied are / were you with your working situation during the crisis?
  - a. What were the reasons?
  - b. What else affected your during this time?
- 3. Did your working situation improve or got worse while working remote during the crisis?
  - a. Please explain why.
  - b. Do you expect future changes, either perceived as positive or negative?
- 4. How satisfied is / was your time during this pandemic?
- 5. How satisfied are you with the inner team collaboration while working entirely remote?
- 6. Would you classify your team rather as collaborative or as competitive?
  - a. Please explain what collaborative and competitive means to you.
  - b. Could you give an examples why you classify your team as collaborative, competitive?
- 7. Experienced DSD workers: What is the most important team characteristic / the best working mode for working from home?
- 8. Experienced DSD workers: Please mention the most important best practice/s regarding work from home.

## **Main Challenges**

- 9. What are / were your main challenges in remote work during the corona crisis? Experienced DSD workers: Did the main challenge change because of the pandemic? And if yes, what are / were your main challenges in remote work before the corona crisis?
  - a. Directly related to your work?
  - b. Other challenges?
- 8. How did those main challenges impact your work?
- 9. Can you give an example for the challenges mentioned?
- 10. Did you do anything to face these challenges?
- 11. What are / were your team's / colleagues' main challenges in remote work during the corona crisis?
- 12. How did you cope with the situation where personal contact is missing?
- 13. Did you substitute personal contact (e.g. with having virtual coffee breaks...)?
- 14. Did you have any problems with missing equipment (f.e. mouse, monitor) or with insufficient tools (f.e. tools for video conferences)?
  - a. If yes, how did you cope with that?
- 15. Does your work depend on other colleagues?
  - a. If yes, did this effect your remote work?

#### Correlation between employee satisfaction and main challenges

- 16. Which challenges affected your job satisfaction the most?
  - a. How?
- 17. What was your worst job-related experience during working remote in the corona crisis?
- 18. Which chances do you see in the crisis?

## **General Questions**

- In which department are you working?
- In which role are you working?
- Are you still working entirely remotely?
- Is your team still working entirely remotely?

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A.3 Ordered logit analysis

## Ordered logit models

- Coefficients are reported as odds ratios, where the null effect is 1 (values smaller than 1 indicate a negative effect; values greater than 1 indicate a positive effect)
- References [xx] are described at the end of the table

		Desicion- making			Collabo- ration		Communi- cation
	ID VARIABLES	(2) Approval decision postponement	(3) Approval decision deceleration	(4) Approval negative impact on planning	(5) Approval satisfied with collaboration	(1) Approval no effective work possible	(6) Frequency team communication (how often per day)
Collabo- ration	Approval: My team is						
rauon	collaborative	0.910	0.963	0.650** [10]	1.533* [7]	0.570** [7]	1.048
	competitive	(0.188) 1.164 (0.176)	(0.200) 1.481** [9] (0.232)	(0.133) 1.251 (0.191)	(0.349) 0.799 (0.135)	(0.128) 0.994 (0.163)	(0.238) 0.782 (0.128)
	agile	1.023 (0.246)	0.592** [9] (0.147)	0.971 (0.239)	1.417 (0.383)	1.279 (0.340)	1.672* (0.453)
	flexible	0.646 (0.174)	1.431 (0.377)	0.691 (0.190)	1.153 (0.330)	1.366 (0.381)	0.676 (0.188)
	Process oriented	0.887 (0.199)	0.766 (0.173)	1.097 (0.243)	1.441 (0.358)	1.312 (0.311)	1.131 (0.256)
	Result oriented	1.145 (0.289)	0.876 (0.224)	1.097 (0.288)	1.177 (0.335)	0.639 (0.178)	1.254 (0.342)
	Approval need to be reachable	1.321*	1.338*	1.114	0.965	1.169	1.031
	at core times Approval depend on	(0.213) 1.140	(0.206) 1.048	(0.171) 1.552**	(0.162) 0.609** [8]	(0.188) 2.379***	(0.160) 1.082
Communi- cation	other colleagues Communication frequency before crisis (more often or less)	(0.211) 0.724	(0.192) 1.292	(0.299) 0.934	(0.127) 1.061	[8] (0.534) 1.429	(0.215) <b>0.409</b> ***
Familiarity with remote work	Remote work before crisis (individual)	(0.197) 0.771	(0.334) 1.163	(0.244) 0.916	(0.305) 0.983	(0.394) 0.795	(0.119) 1.098
	Remote work in the team (how many worked remote on a	(0.134) <b>0.755</b> **	(0.197) <mark>0.750**[9]</mark>	(0.158) 0.804* [10]	(0.191) 1.097	(0.146) 0.928	(0.195) 0.895
Division	regular basis)  Division (Reference:	(0.100)	(0.098)	(0.105)	(0.159)	(0.125)	(0.121)
Division	Data Analytics/Reporting)						
	IT infrastructure/support	0.395	1.084	0.627	0.767	3.827*	2.454
	Conception/strategy	(0.303) 0.926	(0.717) 1.325	(0.413) 0.125**	(0.537) 0.634	(2.639) 2.883	(1.620) 3.246
	Software development	(0.653) 1.088	(0.934) 0.432*	[10] (0.105) 0.393** [10]	(0.507) 1.263	(2.201) 1.037	(2.590) <b>3.037</b> **
Communi- cation	Communication before crisis (Reference: Chat) Confluence /Wiki	(0.480)	(0.193)	(0.175)	(0.619)	(0.495) <b>8.351</b> **	(1.464)
	Email	(1.066) 1.396	(2.717) 0.911	(1.123) 1.439	(0.398) 1.355	(7.930) 1.043	(0.269) 0.486*
	Others	(0.590) 0.714	(0.391) <b>8.394</b> **	(0.623) 2.375	(0.640) 5.180	(0.460) <b>8.242</b> **	(0.208) 1.308
	Phone	(0.624) 0.493 (0.288)	(7.195) 0.819 (0.456)	(2.030) 1.566 (0.881)	(5.289) 1.610 (1.035)	(7.625) 0.619 (0.379)	(1.082) 1.337 (0.776)

<b>Tools</b> No new tools to support crisis	0.859	0.279**	0.744	1.181	0.386*	3.447**
(Reference: yes)	(0.424)	(0.142)	(0.374)	(0.641)	(0.202)	(1.920)
Observations Pseudo R-squared <i>Linktest (Significance, -</i>	64 0.170	64 0.199	64 0.216	64 0.228	64 0.315	64 0.204
= not  sign.) Pred Pred <sup>2</sup>	-	* -	*	-	***	***

Standard errors in parentheses
\*\*\* p<0.01, \*\* p<0.05, \* p<0.1

		Communi- cation					Tools	Satis- faction
	VARIABLES	(8) Approval communicatio n is challenging	(9) Approval misunder standings in communi cation	(10) Approval communi cation is exhaustin g	(11) Approval communi cation is good	(12) Approval unequal distributi on of informati on	(13) Satisfied with usage of tools	(14) Approva improve ment of working situation through remote work
Collabo- ration	Approval: My team is							
ranon	collaborative	0.909	0.862	0.908	1.288	0.733	1.767** [14]	1.535** [12]
	competitive	(0.186) 1.227	(0.178) 1.130	(0.175) 1.112	(0.291) 0.816	(0.146) 1.809***	(0.434) 0.597***	(0.318) 1.094
	agile	(0.185) 0.676	(0.177) 0.683	(0.155) 0.998	(0.137) 2.021**	[5] (0.292) 0.519***	(0.116) 0.689	(0.159) 1.294
		(0.164)	(0.172)	(0.223)	(0.553)	[6] (0.125)	(0.187)	(0.304)
	flexible	0.833 (0.219)	1.108 (0.295)	1.015 (0.254)	0.729 (0.215)	1.566* (0.405)	1.796* (0.548)	0.766 (0.198)
	Process oriented	1.026	0.927	0.620** [3]	1.188	0.758	1.849** [14]	1.081
	Result oriented	(0.224) 0.838 (0.213)	(0.206) 0.988 (0.255)	(0.131) 1.002 (0.243)	(0.287) 1.144 (0.314)	(0.162) 1.014 (0.248)	(0.489) 0.798 (0.232)	(0.231) 0.791 (0.199)
	Approval need to be reachable at core times Approval depend on	0.923 (0.239) 1.064	1.461 (0.390) 1.274	1.450 (0.350) 1.250	0.808 (0.225) 0.769	1.160 (0.292) 1.344*	1.590 (0.515) 0.832	0.708 (0.178) 1.257
Communi-	other colleagues	(0.185)	(0.230)	(0.197)	(0.150)	[5] (0.222)	(0.163)	(0.209)
cation	Communication before crisis	0.899	1.000	1.042	1.007	0.890	0.972	1.001
Familiarity with remote work	Remote work before crisis	(0.113) 0.923	(0.129) 1.461	(0.123) 1.450	(0.141) 0.808	(0.110) 1.160	(0.142) 1.590	(0.120) 0.708
	Remote work in the team	(0.239) 1.064	(0.390) 1.274	(0.350) 1.250	(0.225) 0.769	(0.292) 1.344*	(0.515) 0.832	(0.178) 1.257
Division	Division (Reference: Data Analytics/Reporting)	(0.185)	(0.230)	(0.197)	(0.150)	(0.222)	(0.163)	(0.209)
	IT infrastructure/support	0.556 (0.364)	0.427	1.977	1.037 (0.738)	0.429	1.743	0.290*
	Conception/strategy	0.974	(0.295) 0.524	(1.207) 4.073**	2.918	(0.272) 1.278	(1.254) 2.763	(0.189) 0.646
	Software development	(0.677) 0.258*** [1]	(0.380) 0.352**	(2.891) 0.809	(2.318) 3.032**	(0.873) 0.789	(2.270) 0.703	(0.455) 0.843
Communi-	Communication before crisis	(0.121)	(0.164)	(0.325)	(1.521)	(0.331)	(0.347)	(0.358)
cation	(Reference: Chat) Confluence /Wiki	1.051	3.079	1.692	1.148	1.474	1.121	0.724
	E-mail	(0.960) 0.385**	(2.808)	(1.420) 1.810	(1.238)	(1.295) 1.166	(1.223)	(0.669)
	Others	(0.167) 0.196* (0.173)	(0.390) 0.622 (0.584)	(0.717) 0.804 (0.637)	(0.674) 2.831 (2.854)	(0.475) 3.444	(0.230) 0.830 (0.805)	(0.639)
	Phone	(0.173) 0.230**	(0.584) 0.522	2.126	(2.854) 2.227	(2.772) 0.566	(0.805) 0.577	(0.322)
Tools	No new tools to support crisis (Reference: yes)	(0.133) 0.196*** [13] (0.101)	(0.310) 0.402* (0.213)	(1.108) 0.458* (0.212)	(1.379) 1.558 (0.842)	(0.310) 1.241 (0.592)	(0.376) 0.852 (0.468)	(1.110) 2.033 (0.984)
	Observations	64	64	64	64	64	64	64
	Pseudo R-squared Linktest (Significance)	0.226	0.193	0.177	0.217	0.194	0.343	0.163
	Pred Pred <sup>2</sup>	**	***	*	***	***	***	***

Standard errors in parentheses \*\*\* p<0.01, \*\* p<0.05, \* p<0.1

#### **Description of Findings**

- [1] Employees from the division of software development did not agree that communication in remote work was challenging or lead to misunderstandings.
- [2] Employees from the division of software development rated the communication as good, just like employees who characterized their teams as agile.
- [3] Employees who rated their team as process oriented did not agree that communication was exhausting while working from home.
- [4] Employees from the conception and strategy division rated the communication as exhausting.
- [5] Employees who classified their team as competitive agreed at a higher rate that information was unequally distributed as well as employees whose work strongly depended on others.
- [6] Employees who classified their team as agile or as flexible did not experience the issue of unequal distributed information.
- [7] Employees who classified their teams as collaborative agreed on a higher rate that effective work was possible while working from home and they were satisfied with the team collaboration.
- [8] Employees whose work strongly depended on others were less satisfied with the collaboration in the team and tended to agree that effective work was not possible while working from home during the COVID-19 lockdown.
- [9] Employees who classified their team as competitive agreed on a higher rate, that decision-making decelerated through the work from home during the crisis. Employees who characterized their team as agile and employees from teams, in which most of the members before the lockdown already worked from home on a regular basis did not feel an impact of the decision-making velocity.
- [10] The latter and members of teams classified as collaborative did not feel a negative impact on planning during their remote work. This is equally true for employees in the software development and conception and strategy divisions.
- [11] In contrast, employees whose work strongly depended on others agreed on a higher rate that the remote work during the crisis impeded proper planning.
- [12] Employees who classified their team as collaborative agreed at a higher rate that their overall working situation improved through the work from home during the COVID-19 lockdown.
- [13] Employees in whose teams no new tools were introduced due to the remote work, agreed on a higher rate, that communication is challenging.
- [14] Employees who characterized their team as competitive were significantly less satisfied with the provided tools than employees who classified their team as collaborative or process oriented.

## A.4 Code book including code definitions

	List of codes	Definition	Frequen
n of code segments			504
Challenges		Challenges regarding changed working situation.	
Challenges (entire remot	e work)	Main challenges in entire remote work during the corona shutdown.	
Challe and a la	Andrew Transport	Challes and the Control of the Contr	
Challenges rela		Challenges because of insufficient or inappropriate tools.	14
Challenges rela	ated to Mangement	Challenges because long and hierarchical decision-making processes.	15
Challenges rela	ated to Collaboration	Challenges because of ineffective collaboration.	0
	Decreasing motivation	Challenges regarding depending on experts or "bottle necks".	1
	Depending on colleagues	Challenges because of missing innovation and creativity.	7
	Missing innovation / creativity	Challenges because of missing team spirit.	1
	Missing Team Building	Challenges because of the feeling that information ist not equaly distributed.	1
	Unequal distributed information	Challenges because of missing collaboration with other teams / colleagues.	5
	Missing Collaboration across teams	Challenges because of problems in synchronisation or coordination.	1
	Synchronisationissues	Challenges regarding know-how transfer and documentation.	6
	Lack of / or contradictory Explicit	Challenges because new projects or topics are more difficult to	6
	Knowledge	arrange / start by working remotely.	
	Starting new Projects	Challenges in incorporating new colleagues.	2
	Integrating new Colleagues	Challenges because of problems in communication.	8
Challenges rela	ated to Communication	Challenges because of missing communication skills.	1
	Many Meetings / Conversations	Challenges because of inadequate or missing communication tools.	7
	Wrong way of communication	Challenges because of missing personal contact with colleagues.	4
		Challenges because of technical issues / connection problems that hinder proper communication.	1
	Missing Personal Contact /	Challenges because of missing nonverbal communication such as	35
	Estrangement	posture, gesture and facial expressions.	
	Technical Issues	Challenges because of missing office grapevine or smalltalk.	10
	Missing Nonverbal Communication	Challenges because colleagues are not accessible or reachable when	4
	<b>0</b>	they are needed.	
	Missing Office Grapevine	Challenges because of missing office grapevine or smalltalk.	5
	Lack of Accessibility / Urge to be	Challenges because colleagues are not accessible or reachable when	18
	reachable / synchrounous com	they are needed.	
Other challeng	es	Challenges not directly related to decision-making, collaboration, communication or usage of tools.	0
	Support from company (equipment,)	Challenges because of missing support from the company f.e. providing appropriate equipment.	1
	Legal affaires	Challenges regarding legal affaires.	1
	Different time zones	Challenges because of global distribution and different time zones.	10
	Internal Technical Issues	Challenges because of internal technical issues, like problems with connection, software updates or data access.	3
	External Technical Issues	Challenges because of external technical issues (outside of the	1
		company) e.g. network collapse, bad internet connection, etc.	_
	IT-Security	Challenges in ensuring IT-Security.	5
	Home Schooling or other Distractions	Challenges because of various distractions while working from home.	6
	Lack / Change of Daily Routine	Challenges because of missing daily routines.	8
	Missing Office and Equipment	Challenges in setting up a fully equiped working space at home and	12
	Adherence of Work-Life Balance	ensuring IT-security.  Challenges because of difficulties in separating work and private life,	16
		working more than before the crisis or facing personal challenges because of children at home.	
Challenges (hybrid work)		Hybrid work means some people are on site and some people work remotely. This is a situation many companies currently have because of the partly relaxation of the corona situation. Through hybrid work, new challenges arise.	11
Measures / Learnings / B	est Practices	Measures which were taken already to face the existing challenges while working remotely or in a hybride mode during the corona crisis.	81
Team Characteristics		Characteristics of the team the respondent belongs to or personal opinions about certain team characteristics.	
Identification v	with product and culture / Pride	High level of identification with rather the developed products or the company culture resulting in pride in working at the team or the	8

Toxic people	Characterisic assigned to a person who works against the team or does not add any value intentionally.	1
Having the same goal	High level of connection with colleagues through working together on a shared goal	6
Assume responsibility / Decicion making power	High level of self responsibility and commitment of team members.	10
Trust	High level of trust from the company / from the management.	6
Hierarchy and Control	Level of control and layers of hierarchy within the team / within the company.	4
Agile	Characterisic assigned to an agile working team.	5
Competitive	Characterisic assigned to a rather competitive team.	5
Collaborative	Characterisic assigned to a rather collaborative team.	13
Employee (Dis-)satisfaction	Satisfaction or dissatisfaction with the remote working situation	
	during the corona shutdown and the respepective causes for the satisfaction / dissatisfaction.	
Employee Satisfaction	Employee satisfaction in general during the corona shutdown.	
More / more efficient online meetings / conferences	Employee satisfaction regarding more efficient online meetings and more meetings and conferences that could be attented online in general	3
Introvert vs Extrovert	Employee satisfactions as they categorize themselves as an introvert person and thus are satisfied with working alone at home	2
Company / Management Support	Employee satisfaction with the company strategy as well as with the support from the management.	1
Satisfaction with acutal Working Situation	Employee satisfaction with the working situation in general during the corona shutdown.	18
Improvement of Work-Life Balance	Employee satisfaction with the work-life balance during the corona shutdown.	8
Increase in Productivity	Employee satisfaction regarding the productivity of their team or of the whole company during the corona shutdown.	15
Increase of Satisfaction	Increase of employee satisfaction due to the remote work because of the corona crisis.	15
Hybrid Work Approaches	Employee satisfaction with the hybrid mode of work that was set up after the shutdown and allows to partly go back to company for work.	2
Employee Dissatisfaction	Employee dissatisfaction in general during the corona shutdown.	
Decrease in productivity	Perceived decrease in productivity because of dissatisfaction with the working situation.	0
Uneasiness / Discomfort / Pandemic	Employee dissatisfaction because of generel uneasiness and discomfort triggered by the COVID-19 pandemic.	3
Missing Work-Life Balance	Employee dissatisfaction because of missing work-life balance or family-related reasons e.g. children who could not go to school.	4
Work Overload	Employee dissatisfaction because of work overload, over hours or working during evening / night caused by the remote work during the corona crisis.	1
Missing Personal Contact	Employee dissatisfaction because of missing personal contact including also missing private conversations with colleagues.	7
Dependencies	Employee dissatisfaction because of depending on other colleagues who are more difficult to reach while working remote and not together in one office.	4
Technical Issues	Employee dissatisfaction because of technical issues like e.g. connection problems, systems shutdown or bad internet connection.	9
Future impacts of the corona crisis	Possible short and long term impacts of the corona crisis regarding work and prfessional life and chances seen in the crisis for society in general and for work and professional life in particular.	
Chances / Positive impacts	Chances seen in the crisis for society in general and for work and professional life in particular.	32
Short Term Impacts	Possible short term impacts of the corona crisis regarding work and prfessional life.	2
Long Termin Impacts	Possible long term impacts of the corona crisis regarding work and prfessional life.	8