Guidelines for Cultivating a Sense of Belonging to Reduce Developer Burnout

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BURNOUT AFFECTS SOFTWARE DEVELOP-ERS' MENTAL AND PHYSICAL WELL-BEING AND CONTRIBUTES TO THEIR TURNOVER, WHICH HAS GENERATED STRONG INDUS-TRY CONCERNS. OUR PREVIOUS RESEARCH SHOWED THAT THE LACK OF SENSE OF BELONGING IS LINKED TO HIGHER LEV-ELS OF BURNOUT IN SOFTWARE DEVELOP-ERS. SENSE OF BELONGING IS ALSO KEY TO MAKING PEOPLE MORE RESILIENT, AND HAVE BETTER JOB SATISFACTION AND WELL-BEING. IN THIS PAPER, WE REVISIT OUR RE-CENT RESEARCH ON THESE TOPICS TO OF-FER GUIDELINES ON HOW TO PROMOTE A SENSE OF BELONGING IN SOFTWARE DEVEL-**OPMENT TEAMS, WHICH WOULD ULTIMATELY** IMPROVE DEVELOPERS' WELL-BEING.

Resilience through Belongingness

Resilience refers to the ability of an individual to adapt and recover from difficulties, challenges, or adverse situations. It is linked to enhanced mental health and well-being [1]. Establishing a sense of belonging within a team, group, or network of supportive individuals can lay a strong foundation for resilience development [2]. When individuals feel a strong sense of belonging, they are more likely to experience increased job satisfaction, engagement, and overall well-being. Prior research suggests that high belongingness within a team can contribute to higher levels of job satisfaction and lower rates of burnout [3].

Burnout threatens well-being and encompasses feelings of exhaustion on physical, emotional, and cognitive fronts. Understanding burnout in software engineering is important since software developers are more likely to feel fatigued, anxious, experience burnout, and stressed than those who perform mechanical tasks [4].

Similar to other industries, burnout is a likely factor in IT staff's decision to exit organizations and has become a key piece of conversation for talent retention.

Sense of belonging has been shown to prevent or reduce burnout by increasing job satisfaction [3]. By increasing the sense of belonging, one may feel less isolated and find a toolset to increase well-being.

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Fostering a sense of belonging

Belongingness measures to what extent people feel like they are part of a group or fit into a certain group [5]. According to Maslow [6], it is a basic human need. Hagerty and his team [5] go further, saying that belongingness is a unique mental health idea, different from things like loneliness or getting support from others. They define two dimensions for belonging: (i) feeling valued and accepted and (ii) fitting in as your qualities match with the setup or place. Belongingness leads to a positive, supportive work atmosphere.

While the sense of belonging is an important feeling for everyone, it is especially relevant for underrepresented groups, and addressing these needs is key to promoting personal well-being and effective functioning. Research on belongingness in STEM education has highlighted challenges faced by minority groups, such as women in mathematics [7] and Latinx individuals dealing with racially hostile environments, underscoring the struggles these groups encounter in terms of belonging.

Nonetheless, the concept of belongingness holds a comparable significance for software developers. Software development occurs in different ecosystems with different incentives and work structures. Two of the main ecosystems include corporate settings and Open Source Software (OSS).

In corporate settings, software developers are remunerated for their efforts and backed by a centralized Human Resources team. Conversely, OSS projects depend on input from a diverse community that mainly interacts online and encompasses individuals with varied motivations and compensation structures. This community involves volunteers and contributors who may be retained and funded by separate enterprises and foundations. Hence, we investigated belongingness in both these settings—the IT industry and OSS.

While belongingness can be a source of motivation for software developers and can lead to disengagement when lacking, we currently do not have clear guidance to foster a sense of belonging within a team. In the following section, we discuss actions that can be taken by organizations to cultivate belongingness in a software team.

Deciphering Belongingness for Software Developers

To establish guidelines for enhancing belongingness among software developers, we conducted three studies within different software development environments, including both opensource and closed-source environments, illustrated in Figure 1 and summarized in Table 1.

To explore the connection between belongingness and burnout, we conducted Study 1 by analyzing software development teams at a global tech company. We found a positive association between organizational culture and belongingness. More interestingly, *belongingness was found to be positively linked to job satisfaction and inversely related to burnout.*

Motivated to discover additional factors that impact the sense of belonging, to delve into further aspects of belonging beyond membership, and to reveal the dynamics of belonging in different ecosystems, we conducted two other studies. Study 2 [8] was conducted within a large Open Source Software project, while Study 3 [9] focused on software development teams working on another big company that develops proprietary software solutions for clients.

Study 2 investigated belongingness within an OSS team [8], utilizing attributes from the Sense of Virtual Community [2] framework, including (membership, mutual support, knowing and being known, feeling like home, and feeling valued). We explored associations between belongingness and intrinsic motivations, English proficiency, tenure in the team, authoritative cultural traits (power distance), and gender. This study was based on the results from the survey with 318 contributors from the Linux Kernel and showed that the sense of virtual community tends to be more pronounced among individuals motivated by kinship and who have been contributing to the project for a long time. It is characterized by a sense of membership and a strong emotional bond with the group [2]. This feeling is further manifested in the perception that members hold importance for both the collective and each other, which is facilitated by mutual support, sharing of personal identity, and getting to know the identities of fellow members.

We then embarked on Study 3 within the software development teams that produce propri-

Table 1. Summary of studies included in this paper

Study 1: Case Study	Study 2: Case Study	Study 3: Case Study
May 2023	May 2023	Oct 2023
How does organizational culture impact in-	How does a sense of virtual community	How are work appreciation and psycholog-
clusiveness, belongingness, team climate,	develop in Open Source Software projects?	ical safety related to the sense of belonging
work satisfaction, and developer burnout?		in software development teams?
Approach: Analysis of 3,281 survey re-	Approach: Analysis of 318 survey responses	Approach: Analysis of 10,781 survey re-
sponses from software delivery team mem-	from Linux Kernel contributors	sponses from software development team
bers across diverse projects at a proprietary		members across diverse projects at another
software company		proprietary software company
Key Finding: Organizational Culture, Cli-	Key Finding: Intrinsic motivations posi-	Key Finding: Psychological safety and work
mate for Learning, Sense of Belonging, and	tively relate to the sense of virtual com-	appreciation positively correlate with a
Inclusiveness are positively associated with	munity, while gender minorities perceive	sense of belonging to the team. Gender dif-
Work Satisfaction, which in turn is associ-	a weaker virtual community compared to	ferences are observed, with women feeling
ated with Reduced Burnout.	men. Power distance negatively affects the	less belonging. Power distance has a neg-
	sense of virtual community, while English	ative association with belonging, whereas
	proficiency and tenure have a positive asso-	tenure shows a positive association.
	ciation with it.	

etary software at another global tech company [9]. Here, teams interact both online and in person, and we employed the characteristics of belongingness derived from the Sense of Belonging instrument (SOBI) [5], encompassing friendship, trust, acceptance, and value recognition. We brought the Self-Determination Theory [10], which suggests that psychological safety, recognition, and belonging are interconnected psychological needs that promote motivation and engagement, leading to a positive and supportive work environment. In this study, we investigated the correlation between belongingness and psychological safety, work appreciation, tenure at the company, authoritative culture (country culture dimension of power distance), and gender. Results showed that women and those living in countries with high power distance show a relatively low sense of belonging. On the opposite side, those who have more experience feel more belonging than novice members. Nevertheless, when examining the different roles (leaders and non-leaders), gender has a different impact on feelings of belonging. Women who do not occupy leadership positions feel less belonging than those who are leaders [9].

In the present paper, we organized the characteristics of belongingness and the factors that we investigated as associated with belongingness, as shown in Figure 2.

• Belongingness characteristics studied in the IT Industry: being able to TRUST other people from the team, feeling ACCEPTED and VAL-UED by co-workers, having FRIENDSHIP and a good relationship with other members of the team

- Belongingness characteristics studied in Open Source Software: feeling as a MEMBER of the team, being KNOWN BY OTHERS and KNOW-ING WHO TO ASK for help in case of need, feeling VALUED and perceiving the team is LIKE HOME.
- Factors that are associated with belongingness, studied in the IT industry: work recognition (including compensation, leadership recognition, and perceived to make a difference to the company); and psychological safety (including being able to be yourself, feeling safe to share bad news with the team, reporting improper behaviors such as discrimination or harassment, and speaking up and taking risks)
- Factors associated with belongingness, studied in Open Source Software: intrinsic motivations (including kinship and fun) and English confidence (including both spoken and written in technical and non-technical communication).
- Demographic factors associated with belongingness, studied both in the IT industry and in Open Source Software: living in an authoritative culture (high score in Power Distance country culture [11]), gender and tenure.

Improving Belongingness

Based on the evidence found during quantitative analysis of belongingness in Open Source Software and IT industry contexts, we propose guidelines for leaders to cultivate belongingness in the team and thus, reduce burnout. All guidelines presented here are backed by evidence previously collected or supported by the literature. In



Figure 1. The methodology employed to study characteristics and factors associated with belongingness in software development teams. The result from Study 1 was published at ICSE-SEIP 2023 [3], the results from Study 2 were published at ICSE 2023 [8] and the results of Study 3 are going to be published at ICSE 2024 [9].



Figure 2. Characteristics and Factors Associated with Belongingness. Squares depict factors correlated with belongingness, while ovals symbolize the attributes of belongingness probed in the various studies. Arrows signify statistically significant associations uncovered throughout the studies. A positive association signifies an increase, whereas a negative association indicates a decrease.

Fig. 3 we present how the different guidelines' strategies can support achieving the different dimensions of belongingness through the factors (squares) we found associated with the sense of belonging.

Timely and consistent recognition. Positive leadership feedback is crucial for acknowledging employees, fostering belongingness, and reducing burnout [3]. Strive for a workplace culture in which individuality is both noticed and VAL-UED[12]. Crafting meaningful feedback can be complex, requiring consistency, timeliness, tailoring, and appropriateness. Consistency involves regular recognition, ideally quarterly, to maintain impact without overwhelming. Timeliness ensures prompt acknowledgment to sustain the

significance of accomplishments. Tailoring recognition of an employee's actions is important, as generic thanks can be discouraging. Leaders can articulate the impact of individual efforts on the software quality or the team's sustainability. For instance, leaders can highlight the project achievements, such as delivering software on time or delivering code that meets high-quality standards by being bug-free. Furthermore, recognition should go beyond technical accomplishments, encompassing actions that support team dynamics. -e.g., acknowledging instances where a senior developer paired with a junior developer helped the junior's growth. Appropriateness involves using suitable approaches and communication channels. People prefer various forms

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Figure 3. Strategies to Cultivate Belongingness

of recognition—public praise, private messages, or tangible rewards. Understanding preferences and using multiple channels, like email, phone, or in-person interactions, helps foster a sense of VALUE and connection. Tangible expressions of appreciation include job security, transparent career advancement opportunities, and social welfare benefits for workers.

Transparent promotion rules and no glass ceiling: Establishing a workplace culture centered on office politics and internal rivalries can erode trust and leave employees feeling that their workplace lacks fundamental fairness. Healthy competition can be beneficial, but overly competitive atmospheres can erode camaraderie and a sense of belonging. Even leaders committed to creating an equitable workplace must continually challenge themselves to identify areas where they may fall short. Weak leadership and favoritism can tarnish efforts to build an inclusive workplace, whereas exceptional leaders will cultivate an inclusive environment for everyone. The promotion rules need to exist and be followed. Promotions are the organization's opportunity to demonstrate its VALUES and a key area where your organization can fail to live up to its stated ideals. For example, if leaders tout the importance of women workers, but keep overlooking them for promotions when their skills match technical team leaders' or management positions, TRUST is lost. Those women will feel their coding skills are undervalued and they do not belong in your organization. Hence, opening the criteria to advance to higher level positions in the company, or becoming an OSS maintainer is crucial [13].

Diverse benefits and initiatives so everyone feels included: Providing employees or OSS contributors with benefits and initiatives that honor their unique contributions to the organization demonstrates that business success is directly linked to whether or not employees feel like they are ACCEPTED and belong. Gartner's research [12] indicates that offering tangible benefits that cater to diverse needs, such as flexible work schedules and emotional well-being programs, enhances feelings of inclusion by as much as 38%, especially for minorities. When considering diverse needs to create strategies of benefits and initiatives, the organization is bringing a message that there is not "one size fits some" with the expectation that everybody else squeezes in. These displays of appreciation convey your genuine concern for their individual requirements both within and outside the workplace. Holding celebratory events about underrepresented groups (e.g., Black Women's History Month, Chinese New Year's Eve) is a highly effective strategy to cultivate belonging for a diverse set of people [12].

Create intentional connections through collaborative tools as online interest groups for members, chat rooms, instant messaging, and discussion forums can be provided to encourage team involvement that happens in virtual settings. Members of the team can use those shared spaces to ask questions and obtain MUTUAL SUPPORT, but also to build social capital and develop relationships, find people with similar schedules and interests for pair programming [14], being able to KNOW OTHER MEMBERS AND BEING KNOWN BY OTHERS TOO. Peer programming and shared spaces are also important for contributors who are intrinsically motivated by kinship to work "together" on issues (e.g. deploying code together) discussing and collaborating on similar interests. Leaders should manage pull requests, mailing lists, or group messages, and guarantee that members' posts are not being missed and that the communication adheres to the code of conduct or company policies.

Conduct blameless postmortems to improve PSYCHOLOGICAL SAFETY and build trust across the team. Altering behavior and work patterns shift culture. Teams can establish practices for a non-authoritative and generative culture that encourages information sharing and trust, increases the sense of belonging, and reduces burnout [3]. This involves applying an organizational culture model focused on generative behaviors that can be done during Agile retrospectives, training messengers to bring bad news and training the group to learn from failure, fostering an environment where risk-taking is accepted, where the messenger is not punished, and members address issues early and emphasize inquiry over blame.

Create optional in-person opportunities to meet as meetups, group meetings, and conferences. In-person interactions can significantly boost FRIENDSHIP through social interactions. DevOps Days¹ and The Linux Foundation gatherings² are examples of global events where developers share ideas, learn, and collaborate. While face-to-face interactions in these events are easier for those with English proficiency, others can also actively engage in conversations in a friendly, safe environment to develop their language skills and gain the confidence to communicate effectively in English. Additionally, spontaneous office exchanges and feedback loops amplify the feeling of belonging [15]. Following the pandemic, several software developers shifted to remote work, engaging primarily through virtual tools, either entirely or partially. Encountering one another, even if not on a daily basis and particularly without the compulsion of an on-site work arrangement, contributes to cultivating a sense of belonging and alleviating job burnout.

Engage newcomers through informal gatherings Utilize ice-breaker questions, focusing on safe and casual topics like favorite food or hobbies and inviting opinions and perspectives into the conversation, especially during the first meetings of a software development project.

¹https://devopsdays.org/ ²https://events.linuxfoundation.org/ This approach cultivates a relaxed atmosphere that helps the newcomer feel at ease within the group, like FEELING AT HOME. By doing so, both the newcomer and the existing members are prompted to engage, familiarize themselves with others, and share their own backgrounds and preferences. This interaction paves the way for exchanging cultural, geographic, and behavioral insights, ultimately promoting a diverse range of viewpoints and strengthening the bonds among team associates.

Monitoring and adjusting course of initiatives. While numerous variables can influence the outcomes of these initiatives, it remains essential to consistently evaluate their effectiveness. This can be achieved through regular assessments, such as conducting brief monthly surveys that include three or four specific questions designed to gauge various aspects related to a sense of belonging and employee burnout. These assessments serve a vital purpose in several ways: (a) Continuous Monitoring: Ensure that you have an ongoing pulse on the well-being of your employees and have a proactive measure to detect issues early, even before they escalate; (b) Quick Response: Swift responses to emerging concerns when trends or issues are identified to prevent potential negative consequences; (c) Data-Driven Decisions: Enable leaders to tailor their interventions and initiatives based on the feedback received from their workforce; (d) Long-Term Improvement: Over time, assessments can track trends and changes in employee sentiments regarding sense of belonging and reducing burnout.

Distributed remote settings (e.g. OSS projects) pose challenges in observing signs of burnout compared to traditional in-person work environments. However, despite these challenges, software repositories contain valuable data that can be leveraged to investigate potential burnout signals. One way to detect signals of lack of belonging and burnout among OSS contributors is by analyzing communication patterns within the project's repositories [16].

Mining software repositories, sentiment analyses, and Natural Language Processing techniques can be employed to automate the detection of burnout signals. Comments on code commits, discussions on mailing lists, and interactions in project forums provide insights into contributors' engagement levels, communication styles, and overall well-being. Signs of lack of belonging and burnout may manifest in reduced participation in discussions, less constructive feedback, or expressions of frustration and fatigue in communication threads. By analyzing data within repositories, project and community managers can identify contributors at risk of burnout and take proactive measures to support them. This might involve reaching out for encouragement, redistributing workload, providing resources for skill development, or facilitating breaks to prevent burnout from escalating and negatively impacting the contributor's well-being and the project's progress.

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