



# **WHY DO DEVELOPERS PARTICIPATE IN OPEN SOURCE SOFTWARE PROJECTS?**

Version 1.01/2024.1.1

Lappeenranta–Lahti University of Technology LUT

Degree Programme in Software Product Management and Business, Master's thesis

2024

Duc Thinh Tran

Examiners: Title First name and Last name (optional degree)

Title First name and Last name (optional degree)

# Abstract

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LUT School of Engineering Science

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51 pages, 11 figures, 5 tables and 1 appendices

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This thesis embarks on an in-depth exploration of the intricate landscape of open-source software development, with a particular emphasis on the multifaceted motivations that drive developers to contribute to these projects. Utilizing Kitchenham's framework as a guiding principle, a systematic literature review was conducted, meticulously examining existing research to uncover the diverse factors influencing developer engagement. By analyzing a carefully curated selection of 20 pertinent articles, this study delves into the social impact, challenges, and underlying motivations within the open-source software community. The findings aim to illuminate the complexities of developer behavior in open-source projects, identify gaps in existing theoretical frameworks, and provide a foundation for future research in this dynamic and ever-evolving field.

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Last I would also like to express my sincere gratitude to my family, my relatives and especially my mother for her unwavering love. Her constant encouragement, especially during challenging moments, motivated me to persevere and finish my thesis. I am truly fortunate to have her in my life.

Despite our commitment, I'm aware that this project is still inadequate and contains inevitable errors. I would like to receive feedback from lecturers in order to improve furthermore.

*Duc Thinh Tran*

*Lahti, May 2024*

## Acronyms

**ACM** Association for Computing Machinery

**GPL** General Public License

**IEEE** Institute of Electrical and Electronics Engineers

**OSS** Open-source software

**PR** Pull Requests

**SLR** Systematic Literature Review

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# 1 Introduction

In today's rapidly evolving landscape of software development, open-source software has become a transformative force [12]. Its collaborative model fuels innovation by making code accessible, fostering a global community of developers, and lowering barriers to entry.

The widespread adoption of the internet created a natural environment for open-source collaboration and distribution [35]. Additionally, the emergence of cloud computing and agile methodologies has further streamlined the development process, empowering developers to build and deploy open-source solutions with unprecedented speed and flexibility [32].

Moreover, the exponential growth of data highlights the need for solutions capable of handling vast amounts of information [3]. This need drives the development of fields such as big data and data science, which often rely heavily on open-source tools and libraries.

The accessibility and adaptability of open source software have democratized the software landscape. It offers a valuable alternative to proprietary solutions, particularly for individuals, start-ups, and organizations with limited resources. The collaborative nature of open-source development often leads to rapid innovation and the creation of robust, secure, and continuously improving software solutions.

While the benefits of open-source software are widely recognized - from its cost-effectiveness and adaptability to enhanced security and strong community support – the motivations that drive developers to contribute their time and expertise to these projects remain less understood. This gap in our understanding highlights an important question: why do companies and individuals dedicate themselves to creating and maintaining the open-source software that powers so much of our digital world?

Investigating this question is crucial for several reasons. Understanding developer motivations offers insights into how we can ensure the long-term sustainability of open-source projects. Furthermore, companies and organizations hoping to attract top talent within the open-source space would benefit from knowing what drives developer participation within these communities. Uncovering these motivations can also shed light on how open-source projects function, how collaboration occurs, and how knowledge is shared and developed.

## 1.1 Objectives

This research project ventures beyond the surface of open-source software development, delving into the intricate web of motivations that drives developers within this collaborative



community. By employing a multifaceted approach that combines empirical analysis with in-depth qualitative inquiries, the study seeks to illuminate the underlying forces that propel developers to contribute. These forces encompass not only the tangible incentives but also the value systems and socio-technical factors that influence their engagement. Ultimately, this investigation aims to provide a more nuanced understanding of the dynamics that shape the ever-evolving landscape of modern software development, with a specific focus on the crucial role played by open-source communities.

## 1.2 Motivation

As a former software engineer engrossed in the dynamic world of software development, my daily experience was enriched by the constant use of open-source software. From leveraging fundamental frameworks like ReactJS from Facebook to seamlessly integrating libraries and packages sourced from NPM, open-source solutions became an indispensable aspect of my workflow. Their ubiquitous presence became so ingrained in my routine that their influence often went unnoticed, seamlessly woven into the fabric of my daily tasks. However, as I transition into the realm of program software product management, I find myself drawn to exploring a new frontier – one that encompasses not only the technical aspects but also delves into the world of human psychology. It is this intersection of technology and human behavior that piques my curiosity and drives my desire to embark on this research endeavor.

Through this thesis, I aspire to investigate the nuanced interplay between open-source software adoption and the human factors influencing developer behavior and decision-making processes. By unraveling these complexities, I aim to contribute to a deeper understanding of how human elements shape the adoption, utilization, and evolution of open-source software, ultimately informing more effective software product management strategies.

## 2 Research questions

This thesis seeks to explain the factors influencing developer participation in open-source projects. To achieve this, the study will delve into three key areas. First, it will explore the primary motivations driving developers to contribute their time and expertise to collaborative open-source endeavors. Second, the research will investigate the impact of social dynamics within these communities. This includes examining how interactions with other developers and potential networking opportunities influence a developer's decision to participate and their ongoing engagement. I would like to approach these two questions using a Systematic Literature Review methodology, which will be discussed in detail in chapter 4.1.

Finally, the study will identify the barriers and challenges that developers encounter when working on open-source projects. It will then explore the strategies and solutions employed by developers to navigate these obstacles and ensure continued participation. By addressing these multifaceted aspects, this thesis aims to provide a comprehensive understanding of the dynamics shaping developer involvement in the open-source landscape.

### 2.1 What are the primary motivations driving developers to participate in open-source software projects?

This question seeks to understand the underlying reasons why developers choose to contribute their time, skills, and expertise to collaborative software development efforts that are open and freely accessible to the public. By exploring this question, the study aims to uncover the diverse range of factors that incentivize developers to engage in open-source projects. These motivations may vary widely among individuals and can include a combination of intrinsic and extrinsic factors.

### 2.2 To what extent do social dynamics, such as community interactions and networking opportunities, impact developer participation in open-source software projects?

Open-source software thrives on the contributions of volunteer developers. While individual motivations to participate have been explored, a gap exists in understanding how the social environment itself fosters engagement. The second question investigates the impact of social dynamics within open-source projects. Specifically, it examines how interactions within the community and opportunities to build professional networks influence the level of developer participation. By studying these dynamics, the study aims to illuminate how open-source communities can be nurtured to maximize developer engagement and project success.

### 2.3 What barriers or challenges do developers encounter when participating in open-source software projects?

Last, a crucial aspect of this research involves understanding the roadblocks developers encounter when contributing to open-source projects. This includes technical hurdles like complex codebases, time constraints, and communication challenges within geographically dispersed communities. Additionally, factors like unclear project direction and unfamiliarity with open-source etiquette can hinder participation. By identifying these barriers, the study aims to provide insights into how developers navigate these challenges and continue to contribute to open-source projects.

## 3 Background

Open-source software (OSS) has become a cornerstone of modern software development. It refers to software that is freely available for use, modification, and distribution. The open-source movement has gained significant traction in recent years, driven by a collaborative development philosophy and the benefits it offers to both developers and users.

### 3.1 Origins and Early Practices

The origins of open source software lie in the early days of computing, where a culture of sharing and collaboration thrived. Programmers in academic and research settings freely exchanged and modified code, driven by a desire to improve the technology they worked with. However, as software began to be commercialized, this openness clashed with the rise of proprietary software models. Restrictions on use and a lack of transparency led to frustration among many programmers, sparking the desire for an alternative.

In 1983, Richard Stallman’s launch of the GNU Project became a catalyst for the modern open source movement [9]. This ambitious initiative aimed to create a completely free operating system built on the principles of software freedom. Stallman’s advocacy for free redistribution, user modification rights, and transparent development laid the philosophical foundation for the open source movement.

Early open source projects relied heavily on collaborative development through online communities of programmers. This distributed model allowed for efficient bug fixing, rapid development, and fostered knowledge exchange. Moreover, the creation of licenses like the GNU General Public License (GPL) was crucial. These licenses protected open source freedoms, ensuring that software and any modifications made to it would remain accessible to all [26].

Several notable projects defined the early era of open source software. Linus Torvalds’ creation of the Linux kernel in 1991 became the poster child for successful open source development, eventually forming the heart of countless operating systems. Additionally, the GNU Project provided essential tools, the Apache Web Server became the dominant force powering the internet, and BIND played a critical role in the internet’s infrastructure. These landmark projects proved the viability and potential of the open source model.

### 3.2 Defining Open Source

The definition of open source software is contested. It sparks debate between those who see it as synonymous with “free software” and those who view “open source” as a distinct

approach [13].

“Free software”, a term stemming from the GNU project, prioritizes user freedoms over cost. At its core, free software grants users the right to use, share, study, modify, and even improve software without restrictions [40]. Access to the source code is vital, as it is what empowers users to exercise these freedoms.

The term “open source” was introduced later than “free software.” While both aim to describe software with accessible source code, there are key philosophical differences. The “open source” term was partly motivated by a desire for a less politically charged, business-friendly label, though its official definition aligns closely with “free software”. Stallman argues that the everyday interpretation of “open source” merely denotes visibility of the source code, not the full freedoms of free software [38]. This ambiguity allows the term to be applied to semi-free or even proprietary software, diluting its meaning.

While open source initiatives appear in many forms, there are two primary types: open source software and open source content [30]. Open source software refers to code that is freely available for anyone to inspect, modify, and distribute. This collaborative approach fosters innovation and rapid development. Open source content, on the other hand, encompasses a wider range of creative materials, such as educational resources, scientific data, and artistic works. Like software, open source content licenses permit users to access, share, and modify the materials under specific guidelines.

### 3.3 Open Source Project

An open-source project is a collaborative endeavor where the source code of a software program or application is made freely available to the public. This means that anyone can view, modify, and distribute the code according to the terms of the project’s license. Open-source projects typically encourage transparency, community-driven development, and collaboration among developers from diverse backgrounds.

One of the most widely used definitions of open source comes from the Open Source Initiative (OSI), which defines open source software as having a license that meets the following criteria in the figure 1.

Some of the most popular and influential open-source projects:

- **Linux:** An extremely popular and versatile operating system kernel. Linux powers a vast range of devices from servers and supercomputers to smartphones and embedded systems. It is known for its stability, security, and customization options [11].

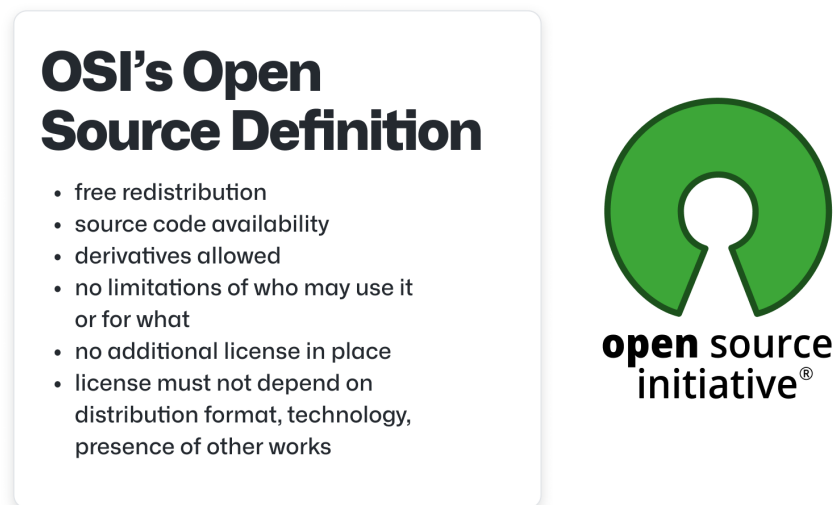


Figure 1: OSI's Open Source Definition [19]

- **Git:** A distributed version control system that has become the de facto standard for software development. Git allows developers to track changes to code, collaborate easily, and experiment with different branches of development [27].
- **Apache HTTP Server:** One of the most widely used web server software in the world. It is responsible for serving a significant portion of websites on the internet. Apache is known for its reliability, flexibility, and extensive features [10].
- **Python:** A high-level, general-purpose programming language that emphasizes readability and ease of use. Python is extremely popular in fields like data science, web development, machine learning, and system administration [37].
- **TensorFlow:** A free, open-source toolset designed to make machine learning accessible. It offers a wide range of tools, libraries, and a supportive community, so both researchers and developers can create and use powerful ML applications [8].

### 3.4 Ownership and Licensing

The concept of ownership within the open-source software landscape deviates from the traditional models of individual or corporate proprietorship. While thousands of developers might contribute to a single open-source project, the idea of ownership is more accurately framed in terms of rights, intellectual property, and copyright [16]. In this context, it's vital to understand the pivotal role of open-source licenses.

In the world of software, open-source licenses reign supreme. The MIT License offers broad permissions for use, modification, and distribution, making it incredibly developer-friendly [34]. Similarly, the Apache License 2.0 is permissive and emphasizes providing clear copy-

right and patent notices [36]. For those seeking “copyleft” protection, ensuring that derived works stay open-source, the GNU GPL is a common choice [26].

Licenses establish the boundaries and freedoms granted to users and contributors in utilizing and modifying open-source software [24]. These licenses come in a variety of forms, each with its own set of rules and restrictions. Some licenses, for example, expressly prohibit the sale of the original software or its derivative versions [28]. This is done to safeguard the open-source ethos and prevent commercial exploitation that may stifle community-driven development.

In sum, understanding the intricate interplay of ownership and licensing is essential for navigating the open-source ecosystem. While traditional notions of ownership take a backseat, the principles of intellectual property, copyright, and the specific terms of open-source licenses dictate the rights and responsibilities of all those who interact with this collaborative software model.

### 3.5 Morden adoption and future

OSS has become a firmly established pillar of the software development landscape, and its influence is poised to grow further in the coming years. As the open-source community continues to mature and address its challenges, we can anticipate the emergence of even more innovative and powerful solutions driven by this collaborative model.

While the origins of open source can be traced back to the 1960s, with companies like IBM providing free software with their early mainframe systems [29], its widespread adoption has accelerated significantly in recent decades. Despite the dominance of tech giants like Google, Apple, and Microsoft in the commercial sphere [20], these companies also play a pivotal role in the open-source ecosystem, particularly through contributions on platforms like GitHub.

The substantial impact of open source is exemplified by EU-based companies, which invested an estimated €1 billion in OSS in 2018. This investment yielded a significant return for the European economy, with an estimated contribution ranging from €65 to €95 billion [6].

Figure ?? underscores the active participation of tech leaders in the open-source movement. In 2020 alone, 5,709 Google employees submitted over ten commits to GitHub’s public code repository. This was closely followed by contributions from Microsoft, Red Hat, IBM, and others...

Current observations indicate a heightened workload for maintainers of open-source projects. Notably, the majority of contributions from external developers primarily consist of non-code based interactions such as comments, questions, issue reports, and pull request reviews. In contrast, developers employed by organizations continue to contribute code to their respective company's projects at a significantly higher rate than external contributors. The figure 2 illustrates this trend, showing that most contributions are made by external developers, which did not belong to the organization that owns the repository.

Analysis of successful commercially-backed open-source projects on GitHub reveals that salaried developers employed by the companies behind these projects regularly contribute to them. This suggests that companies foster the most active and engaged communities when their developers actively participate as members of those communities, rather than simply releasing code under an open-source license.

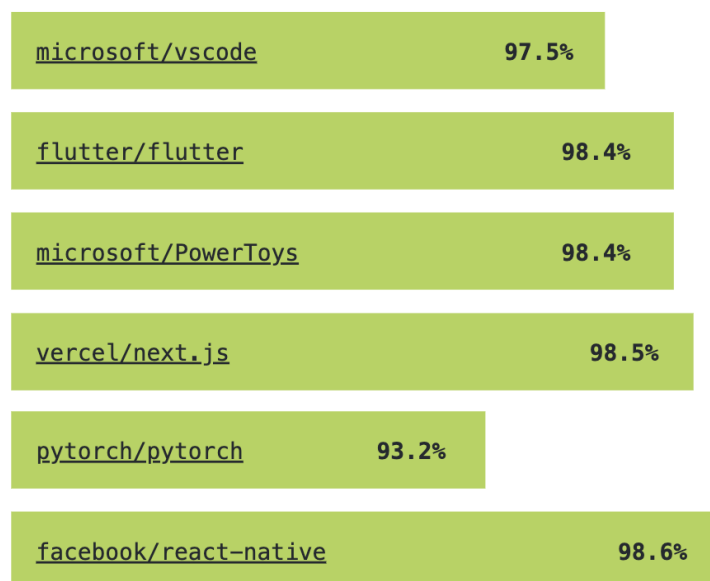


Figure 2: Percentage of External Contributors

The open-source movement's trajectory promises transformative impacts across industries, fueled by increasing collaboration, transparency, and knowledge sharing within its expanding community. This trajectory indicates the emergence of groundbreaking technologies, tools, and solutions that will serve the interests of both users and developers, underscoring the potential of open source to revolutionize sectors and drive innovation on a global scale.



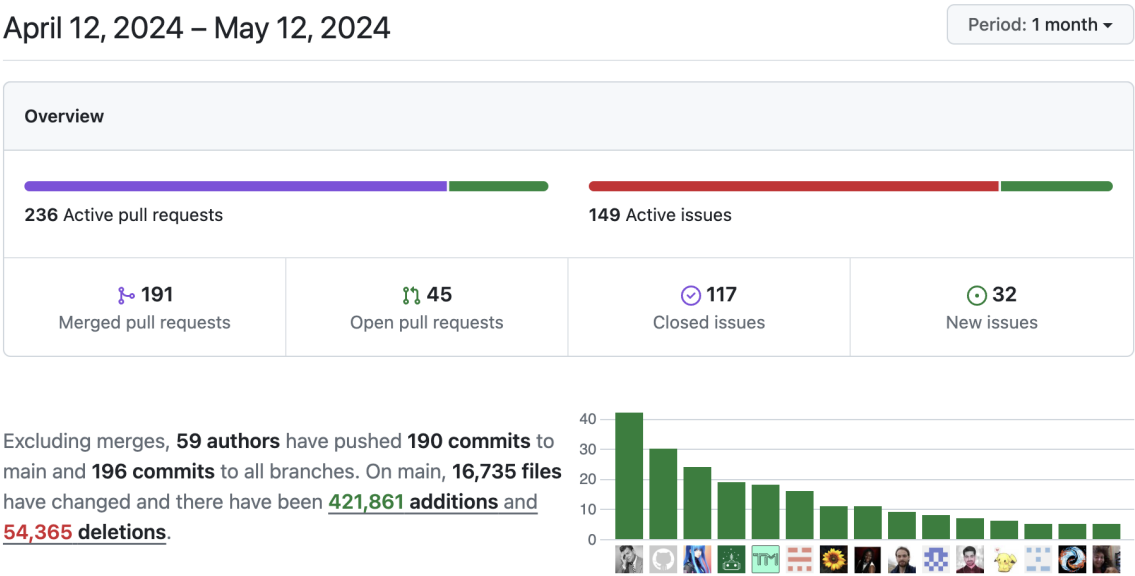


Figure 3: FreeCodeCamp’s Open Source Contribution

## 4 Research methods

This thesis delves into the complex motivations behind developer participation in open-source projects by combining a Systematic Literature Review (SLR) and an in-depth case study. The literature review establishes a robust foundation of knowledge, while the case study illuminates the nuanced social interactions and experiential factors shaping individual developers' decisions to contribute.

### 4.1 Systematic Literature Review

SLR offers a disciplined research method that promotes a clear, targeted investigation through a well-defined question. This study employs the SLR methodology as outlined by Kitchenham, ensuring a reliable and unbiased review [22].

#### 4.1.1 Systematic Literature Review definition

SLR is a meticulously planned research approach aiming to identify, evaluate, and synthesize all available evidence related to a clearly defined research question [22]. It employs a transparent, reproducible protocol to minimize bias, emphasizing comprehensiveness and critical appraisal of included studies.

The methodology consists of three main phases. First, in the planning phase, researchers must clearly define the research questions that guide the entire review. A detailed review protocol should then be developed, outlining the search strategy (databases, search terms), study selection criteria (e.g., publication types and dates), quality assessment methods, data extraction plans, and the strategy for synthesizing the findings.

The second phase involves conducting the review. This includes identifying research using the search strategy, selecting studies based on the eligibility criteria, critically evaluating study quality, extracting the relevant data, and finally, synthesizing that data using techniques like meta-analysis or thematic analysis.

Finally, the reporting phase focuses on transparently documenting the entire SLR process for reproducibility and critical assessment. Researchers must present the results in a clear manner, addressing the initial research questions and their implications, while also acknowledging any limitations within the review process.

#### 4.1.2 Systematic Literature Review approach

Open source software development presents a unique model of collaboration where developers voluntarily contribute their time and expertise. Unlike traditional software engineering environments, motivations in open source extend beyond direct financial compensation. Researchers have investigated these motivations from various perspectives, including psychological, economic, and social factors. This complex landscape can lead to potentially varied interpretations of what drives participation.

The SLR will lay the groundwork for my thesis by providing a thorough understanding of current research on open source developer motivations. Based on the SLR findings, I will be able to identify under-investigated areas or potential gaps in the theoretical frameworks used to explain developer behavior.

## 5 Systematic Literature Review

Guided by Kitchenham’s SLR framework, this study carefully addressed review planning (defining research questions, developing a protocol), conducting (literature search, study selection, data extraction and quality assessment), and reporting [22].

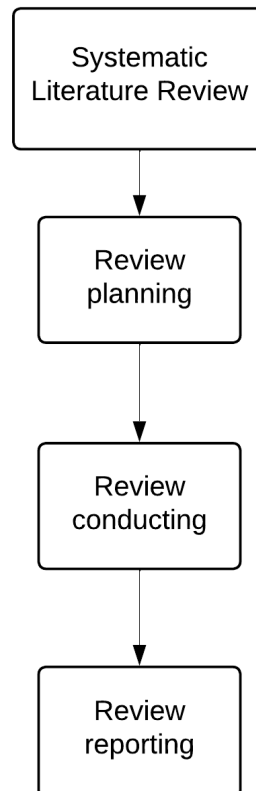


Figure 4: Systematic Literature Review process [22]

The figure 4 shows an overview of my work to execute a systematic literature review. I meticulously outlined a protocol and defined my overarching research questions 1 and 2. A comprehensive search strategy was then established to pinpoint pertinent articles within electronic databases relevant to the field of open source software motivation. Stringent inclusion and exclusion criteria ensured the selection of methodically sound studies. Following the search, I carefully screened titles and abstracts of retrieved database articles. Studies initially deemed relevant underwent a thorough full-text analysis. This systematic review will culminate in a detailed report encompassing search strategies, selection criteria, the number of articles evaluated at each stage, and an overarching synthesis of the findings.

## 5.1 Review planning

In chapter 2, I explored the process of defining a research question. Here, I will concentrate on developing a protocol for the initial review planning phase of a SLR. While numerous scientific databases exist online, selecting the most suitable ones for evidence synthesis can be challenging [18]. This section will offer guidance on database selection and explain the rationale behind different choices.

### 5.1.1 Search criteria

Building on a previous study from Chua and Zhang [2], I established inclusion criteria to ensure the selected articles addressed my research questions and utilized strong methodologies:

- Research articles and conference papers, peer-reviewed and available through major academic search platforms like Google Scholar, Springer, Institute of Electrical and Electronics Engineers (IEEE), Association for Computing Machinery (ACM), Science Direct.
- Restriction to English-language sources.
- Disciplines in Computer Science, Software Engineering
- Publication date: from 2000 to 2024.
- Specific search terms (“open source” OR “open source software”) AND (“motivation” OR “contribution challenges” OR “social dynamics impact” OR “interest” OR “contribution barriers”) within titles or descriptions.
- Prioritization of publications from leading information systems conferences and journals. Ex: ACM/IEEE International Conference on Software Engineering, IEEE Transactions on Software Engineering, Journal of Systems and Software,...

These search terms were employed to address the three research questions which are categorized in the table 1.

Category	Search terms
1	OSS motivation and all synonyms
2	Social dynamics impact on OSS and all synonyms
3	Contribution barriers of OSS and all synonyms

Table 1: Specific categories of search terms

### 5.1.2 Data source

To identify relevant literature, I executed our search strings across multiple databases. Each database was queried with the complete set of search strings, yielding varying results. In some instances, identical search strings produced an overabundance of results, while in others, they returned no results. Databases with no results were excluded from further analysis. The selected databases and their corresponding result counts are presented in the following table 2.

Database	Category 1	Category 2	Category 3
Google Scholar	244 000 results	17 800 results	175 100 results
Springer	623 results	161 results	327 results
IEEE	396 results	68 results	48 results
Science Direct	4 200 results	97 results	15 results

Table 2: Initial search results from scientific databases

### 5.1.3 Inclusion and exclusion criteria

To maintain a focused and methodologically review, I used inclusion and exclusion criteria to pinpoint studies aligned with my research questions. These criteria served as a consistent filter for all potential sources. The specific criteria are outlined below, and they were applied to every study retrieved from our selected databases.

#### Inclusion:

- Accessible: The research paper must be accessible and downloadable either through LUT Academic Library or online database.
- Peer-Reviewed: The paper should be published in a reputable, peer-reviewed journal or conference proceedings. This ensures the quality and credibility of the research.
- Relevant to research questions: The paper must directly address the specific research questions at hand.
- Methodology transparency: The reasearch and data collection methodologies must be metioned.

#### Exclusion:

- Irrelevant content: Exclude papers that deviate significantly from my research questions or lack a clear connection to the area of study.
- Older papers (released before 2000) ought to be disregarded.

- Papers having fewer than four pages were removed.
- Papers cannot be accessed
- Papers were not written in English
- Papers topic were about open source but in hardware, economy, environment,... but not software

#### 5.1.4 Study selection

A further procedures were taken for the final paper selection after applying the inclusion/exclusion criteria to each of the resultant papers.

- Review the title, keyword, abstract, description for filtering
- Excluding duplicated studies.
- Ranking research papers by the number of times they've been cited and relevant to search term by search engine.

The initial search across various databases yielded approximately 500,000 potentially relevant papers. Due to resource constraints, the review process was limited to 50 papers per database. Following the application of inclusion and exclusion criteria, along with further selection procedures, a final set of 20 relevant and suitable articles was identified for this SLR. These papers are listed in table 3, with full details provided in the Appendix 1. The paper selection process is displayed in the figure 5

The figure 6 depicts the collaboration network between authors of 20 selected papers for a systematic literature review on open-source software motivation, social impact, and challenges. The circles represent authors, and the connecting lines indicate co-authorship on a paper. The size of a circle corresponds to the number of papers an author has co-authored within the dataset. Steinmacher and Igor appears to be the most prolific author in this dataset, having co-authored papers with several other researchers.

## 5.2 Review conducting

### 5.2.1 Extract the data

Data extraction is a crucial step in a SLR. It involves the methodical gathering of specific and relevant information from the research papers I've chosen for the review. This process entails pinpointing key data points aligned with the research questions, and subsequently organizing this data systematically to facilitate analysis and synthesis of the findings. Here is the data which will be extract from each paper:

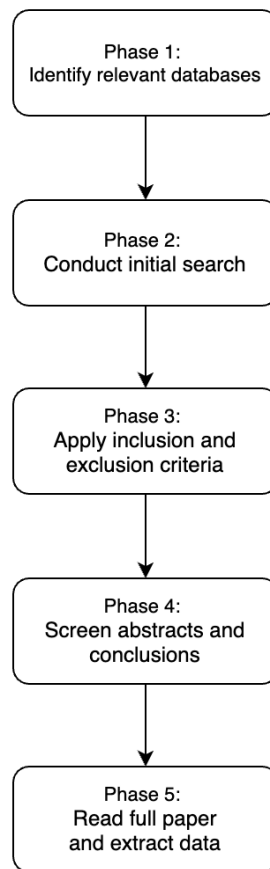


Figure 5: Process of selecting papers for SLR

- Title
- Abstract
- Authors
- Publication date
- Database
- Keyword
- Research method
- Data collection method
- Answers to research questions

### 5.2.2 Synthesis

To systematically analyze the extracted data, we formed two distinct groups (see Table 4) based on their focus:



Publisher	Number of articles	Authors
Elsevier	6	Bitzer, Schrettl & Schröder (2007); Choi & Pruett (2015); Li, Tan & Teo (2012); Oreg & Nov (2008); Steinmacher, Silva, Gerosa & Redmiles (2015); Wu, Gerlach & Young (2007)
AISNET	1	Ke & Zhang, P. (2008)
IEEE	3	Ye & Kishida (2003); Gerosa, Wiese, Trinkenreich, Link, Robles, Treude & Sarma (2021); Zhang, Yuxia (2024)
ResearchGate	1	Zhao, Shengyu (2024)
Springer	3	Steinmacher, Conte, Gerosa & Redmiles (2019); Fershtman & Gandal (2007); Hannemann & Klamma (2013) ; Hannemann & Klamma (2013)
ACM	3	Steinmacher, Conte, Gerosa & Redmiles (2015); Guizani, Chatterjee, Trinkenreich, May, Noa-Guevara, Russell & Sarma (2021) ; Hannebauer & Gruhn (2017)
Informa	1	Roberts, Hann & Slaughter (2006)
Taylor & Francis Online	1	Alexander Hars (2002)
EASST	1	Freeman (2007)

Table 3: Selected papers for SLR

- Group 1: addressing interrelated research questions: This group delves into both research questions 1 and 2. Interestingly, a significant portion of papers addressing question 1 also provide answers to question 2. This overlap suggests a potential relationship between these two research questions. Group 1 comprises a total of 12 carefully selected papers.
- Group 2: exclusive focus on research question 3: This group offers a concentrated exploration of research question 3, without addressing the other research areas. Group 2 contains a total of 5 papers, ensuring a targeted examination of this specific question.

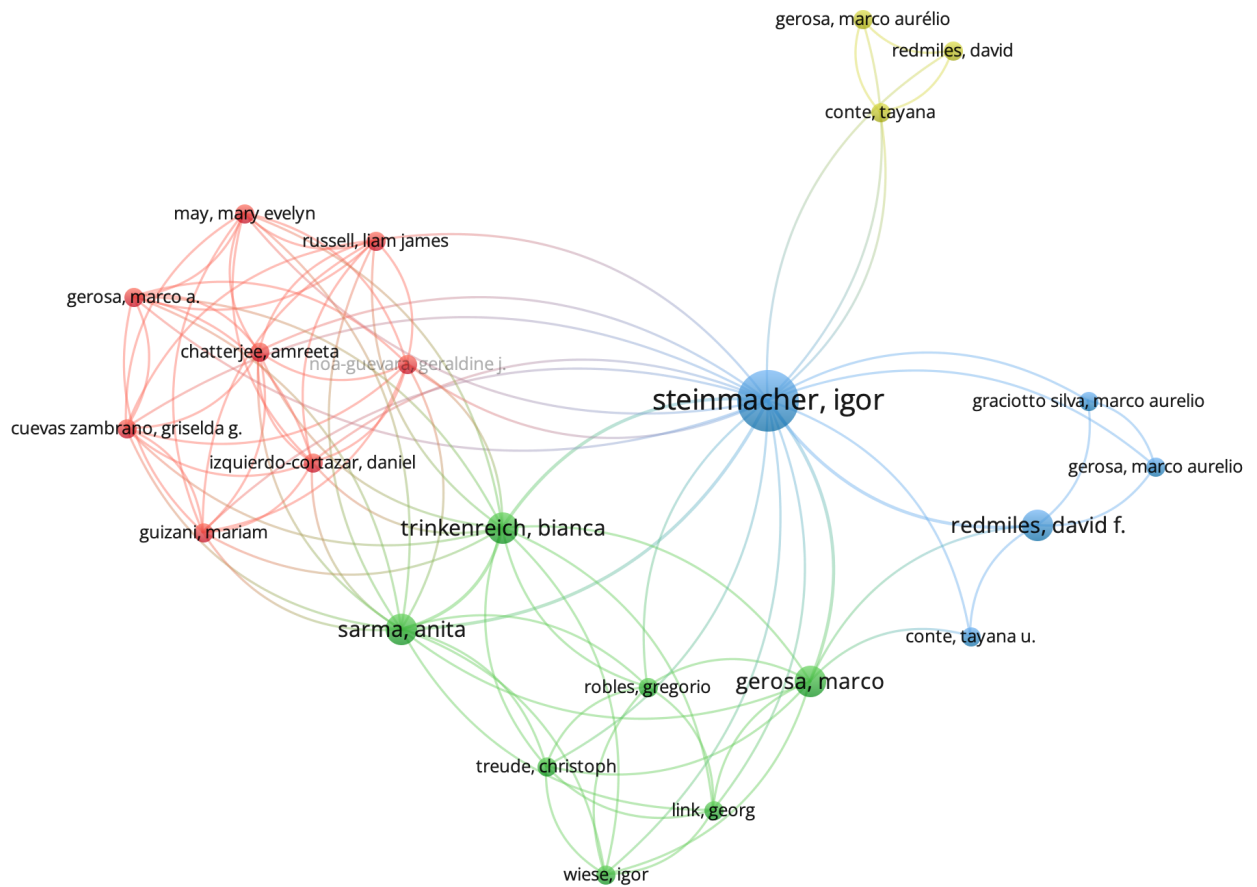


Figure 6: Collaboration among open-source software researchers

Research question	Article ID
1	A05, A06 , A08 , A09, A10, A11, A12, A13, A15, A16, A17, A18
2	A05, A06, A07, A09, A10, A12, A13, A16, A17, A18, A19, A20
3	A01, A02, A03, A04, A14

Table 4: Data synthesis

## 6 Review reporting

### 6.1 RQ1: Primary motivation for developers contributing in open source

The main purpose of this study is to find the motivation of developers contributing in OSS project. For each selected study, I analyzed any motivation reported that was empirically identified or evaluated.

#### 6.1.1 Intrinsic motivations

Our exploration of developer motivation in open-source software (OSS) projects begins with intrinsic motivations, the internal drivers that fuel participation for personal satisfaction rather than external rewards. This encompasses a broad spectrum of factors, including: play value, the inherent enjoyment derived from the coding process; community engagement, the sense of belonging and collaboration found within OSS projects; learning, the opportunity to develop new skills and expand technical knowledge; personal interest, the desire to work on projects that align with individual passions; altruism and ideology, the belief in contributing to a greater good and supporting the open-source philosophy; need for autonomy, the freedom to work independently and creatively; and reciprocity/introjected regulation, the desire to contribute back to the community and maintain a sense of personal responsibility for the project's success. I will delve deeper into each of these intrinsic motivations in the following sections, examining their unique influence on developer behavior within the OSS landscape.

#### 1. Play value

In contrast to traditional software development, which often prioritizes external rewards like monetary compensation and career advancement, OSS projects offer a unique space where play value emerges as a central driving force. Play value, in this context, encapsulates the inherent enjoyment, intellectual stimulation, and creative fulfillment developers experience through the act of programming and problem-solving [5, 42, 43, 23, 14, 7, 25, 21, 1, 31]. Let's examine why this is such a powerful motivator.

For many developers, OSS represents a playground for experimentation and innovation. Unburdened by strict commercial deadlines or rigid specifications, they are free to explore novel ideas, test unconventional approaches, and engage in the iterative process of building software purely for the intrinsic satisfaction it provides. The act of turning concepts into functional code can be deeply rewarding.

OSS communities often tackle complex technical problems that demand creative solutions. Developers who are drawn to intrinsically motivating challenges revel in the opportunity to

dissect intricate issues, devise elegant workarounds, and optimize code performance. This continuous learning process creates a sense of mastery and accomplishment that fuels further engagement.

Commercial software development typically necessitates compromises – feature trade-offs, adherence to proprietary standards, and prioritization of market demands over pure technical curiosity. In contrast, OSS projects offer developers a liberating space to exercise their technical creativity without external pressures. This autonomy nourishes problem-solving and innovation for its own sake.

The collaborative aspect of OSS can itself be a form of play. Engaging with fellow developers, brainstorming solutions, exchanging knowledge, and contributing to a shared creation can be intellectually stimulating and enjoyable. This camaraderie fosters a playful sense of experimentation and discovery within the community.

## 2. Community engagement

The act of conceptualizing the open-source community as a metaphorical family, united in pursuit of shared objectives, can be a powerful catalyst for developer participation [5, 44, 43, 23, 25, 21, 1]. This collaborative environment fosters contributions aimed at communal advancement, even when they may not yield immediate personal gain for the individual developer. Participation in open-source projects can be fueled by a profound sense of belonging and an alignment of personal values with those of project teams and the open-source movement at large.

The chart 7 underscores the complex interplay of motivations that drive developer participation in open-source projects. While social factors are paramount, career considerations and political beliefs also play a significant role. This diversity of motivations highlights the need for a nuanced understanding of the open-source community and tailored strategies to attract and retain developers.

Additionally, a conviction regarding the inherent value of open-source code, paired with a perceived responsibility to contribute to the free and OSS ecosystem, serves as a significant motivator for developers. Cultivating a sense of belonging and fostering a shared purpose within the community or project team can thus be instrumental in empowering individuals to become active participants and contributors in the open-source software development landscape.

## 3. Learning

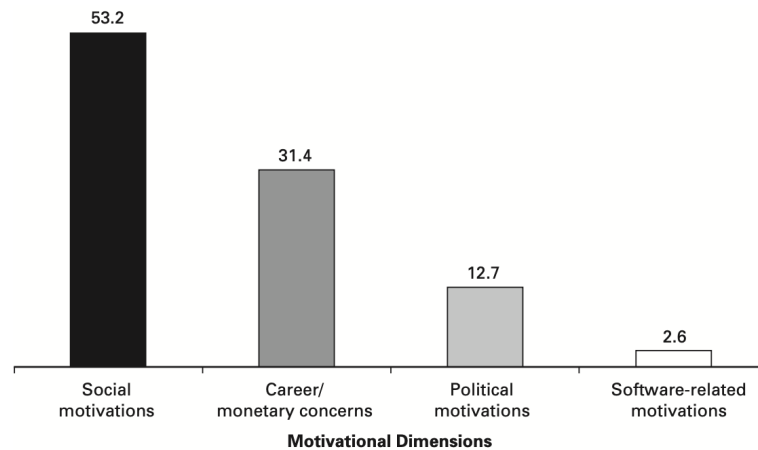


Figure 7: As a proportion of all contributors to OSS, developers by motivation class [15]

Research consistently identifies learning as a primary impetus for individuals to actively engage in OSS communities [42, 44, 43, 23, 41, 14, 7, 1, 31]. OSS projects present multifaceted learning environments; developers are drawn to the inherent opportunities to acquire knowledge from the systems themselves, to collaborate and gain insights from fellow community members, and to reciprocally disseminate their own expertise.

Participation within OSS communities extends beyond the purely technical exchange of knowledge, encompassing a rich social dimension. By directly engaging in open-source projects, developers immerse themselves in a collaborative network of peers, often spanning skill levels and expertise. This fosters a dynamic learning ecosystem where individuals benefit from informal mentorship opportunities, observing problem-solving approaches employed by more experienced contributors, and receiving constructive feedback that accelerates their professional growth.

Moreover, the act of contributing to a shared knowledge base empowers developers and reinforces self-efficacy. The potential for continuous self-development, the pursuit of mastery, and the ability to give back to a community dedicated to knowledge-sharing serve as profound and enduring sources of motivation for many software contributors.

#### 4. Personal interest

The concept of the “personal itch,” as articulated by Eric S. Raymond, illuminates a key motivator for developer participation in OSS projects. Individuals often engage in OSS development to address a specific problem or augment functionality that directly aligns with their personal or professional needs. The desire to create a solution that may not otherwise exist, driven by this personal necessity, serves as a potent catalyst for engagement.

Furthermore, the inherent intellectual challenge of solving complex programming problems stands as a significant motivator for developers seeking to contribute to open-source initiatives. The opportunity to grapple with intricate coding puzzles, apply problem-solving strategies, and ultimately contribute to the solution can be deeply fulfilling for those driven by a passion for programming.

The sense of creativity fostered within the OSS landscape is another powerful draw. Developers are empowered to express their ingenuity, explore innovative solutions, and continuously hone their skills through the development of tools or solutions that serve their own requirements or those related to their work. This blend of personal utility, creative expression, and continuous learning establishes a compelling environment that attracts and sustains developer involvement.

## 5. Altruism and ideology

OSS development thrives in part due to the contributions of individuals motivated by altruism and ideological convictions. This section explores these factors and their influence on developer participation. A significant driver for many developers is the inherent satisfaction derived from assisting others. Contributing to open-source projects allows them to directly improve software used by a wider community. This collaborative environment fosters a sense of purpose, as developers witness the positive impact of their work on others.

Many developers are drawn to the core principles of open-source software, including transparency, collaboration, and the democratization of technology. Participation allows them to contribute to a development model that emphasizes open access and fosters a sense of community. Additionally, developers can be motivated by a desire to create software that benefits the greater good by being freely available and readily modifiable. This aligns with their altruistic desire to contribute to society and maintain strong social bonds.

Altruism and ideological alignment with open-source principles play a vital role in propelling developer participation. Both the satisfaction of helping others and the commitment to open-source ideals create a compelling environment that attracts and retains developers within the OSS ecosystem.

## 6. Autonomy

The open-source software environment provides a platform where developers can exercise a high degree of autonomy, making it particularly attractive to those valuing self-determination. The ability to select projects of interest, dictate their involvement, and contribute indepen-

dently fulfills the intrinsic need for autonomy. This freedom to innovate and pursue solutions without rigid constraints becomes a compelling motivator, drawing developers who seek a sense of control and ownership over their contributions.

Unlike traditional software development environments that might be constrained by rigid hierarchies or top-down management styles, the open-source model empowers developers to chart their own path. They can choose to focus on areas that align with their passions, explore new technologies, or experiment with novel approaches without the need for constant external approval. This sense of agency and self-direction is deeply fulfilling for those who thrive in environments where their initiative and creativity are valued.

## 7. Reciprocity and introjected regulation

Open-source communities thrive on a powerful sense of reciprocity. Developers who have directly benefited from freely available open-source software often feel a deep-seated obligation to give back, fueling their participation and ensuring the continued growth of the ecosystem. This desire to repay the community for the invaluable resources they've received becomes a motivating force.

Additionally, introjected regulation plays a role in influencing developer behavior. The internalization of expectations can lead to feelings of pride, guilt, or shame regarding contributions to open-source projects. This desire to maintain a positive self-image, live up to personal standards, and avoid negative emotions can significantly drive participation as developers strive to meet both their own expectations and those they perceive the community holds.

### 6.1.2 Extrinsic motivations

Beyond the intrinsic factors explored in the previous chapter, extrinsic motivations also play a significant role in driving developer participation in open-source projects. This chapter delves into these external factors, including the potential for signaling skills and experience to potential employers, garnering recognition and building reputation within the open-source community, and potentially obtaining external rewards such as monetary compensation or job opportunities.

I will also examine how extrinsic motivators can intersect with a developer's desire to improve software quality. Contributions to high-profile projects can serve as a powerful signal of competence, while active participation may lead to opportunities to collaborate with skilled developers and gain valuable experience. Furthermore, I will explore the concept of role transformation: how continued involvement in the open-source landscape can elevate a

developer's standing, potentially opening doors to leadership roles, consulting positions, or job offers within companies heavily invested in open-source technologies.

### 1. Signaling and recognition

Participating in OSS projects allows developers to publicly showcase their abilities and commitment. Within the highly competitive software development field, OSS contributions provide concrete evidence of a developer's abilities, enhancing their reputation and potentially unlocking new opportunities. Open-source involvement demonstrates not only technical skills but also a dedication to the broader community and a drive for innovation.

Open-source projects offer developers a platform to display their talents to potential employers, boosting their professional standing. Unlike traditional resumes or interviews that provide a more limited view, OSS contributions offer real-world proof of a developer's capabilities. Employers often see active participation as indicative of both technical skill and the ability to collaborate effectively in a team setting.

The recognition garnered from fellow developers within the open-source community serves as a powerful motivator. The open-source model promotes collaboration, transparency, and continuous improvement, resulting in a space where contributions are acknowledged and celebrated. This validation from peers acts as a potent incentive for developers to further advance their skills and continue making meaningful contributions to projects they're passionate about.

Active engagement in open-source projects supports developers in building strong reputations within their field, positioning them as experts in their niche. Through consistent, high-quality contributions, thoughtful insights, and constructive participation, developers gain respect within the community. This recognition elevates their professional stature and fosters new possibilities for collaboration, networking, and career progression. Ultimately, leveraging their open-source work as a showcase is beneficial not only to the individual developer but also contributes to the advancement of the entire developer community.

### 2. Improving software quality

Some developers engage in open-source projects to create high-quality software that is accessible to a wider audience and can benefit the community. Open-source development fosters a collaborative environment where developers from diverse backgrounds come together to share their expertise and work towards common goals. By leveraging the collective intelligence and resources of the community, developers can create software that is not only robust



and reliable but also tailored to address the evolving needs of users across different industries and domains. This democratization of software development ensures that innovative solutions are not confined to proprietary ecosystems but are freely available for anyone to use, modify, and redistribute.

By participating in open-source projects, developers can access and contribute to software that meets their specific needs and preferences, often surpassing proprietary alternatives. Unlike closed-source software, which may be limited by proprietary restrictions and licensing fees, open-source projects offer greater flexibility and transparency. Developers have the freedom to inspect, modify, and enhance the code according to their requirements, empowering them to create customized solutions that are more efficient, secure, and adaptable. This collaborative and iterative approach to software development not only fosters innovation but also fosters a sense of ownership and pride among contributors, who are motivated by the collective impact of their efforts on the broader community.

### 3. External rewards

While publicly discussions often prioritize the significance of intrinsic motivations, extrinsic rewards such as promotions, financial incentives, increased compensation, and professional advancement remain potent drivers of developer participation in open-source projects [5, 42, 44, 14, 25, 33, 1, 31]. Tangible rewards hold substantial appeal, particularly for those who utilize open-source involvement as a strategic tool for career development and financial gain. Within a highly competitive labor market emphasizing demonstrable skills and practical experience, active open-source contributions tangibly augment a developer's professional credentials and enhance their overall marketability.

Developers may be drawn by the potential financial returns derived from open-source participation, such as new job opportunities or consulting contracts. By establishing a visible record of expertise and successful contributions, developers attract the attention of companies or clients who value their skills, potentially leading to lucrative positions. Beyond traditional employment, open-source involvement can serve as a foundation for supplementary income streams, such as consulting services, training workshops, or speaking engagements, which cultivate both financial rewards and professional recognition.

Furthermore, the pursuit of career advancement and professional distinction strongly motivates developers to engage with open-source projects. Establishing oneself as a thought leader or subject matter expert within the community cultivates opportunities for leadership positions, mentorship roles, or invitations to esteemed conferences and industry events. The visibility and reputation fostered through such contributions heighten a developer's stand-

ing and create new pathways for professional growth and development. Ultimately, while intrinsic motivations undeniably fuel enthusiasm and dedication, extrinsic rewards remain indispensable in attracting and sustaining long-term participation in open-source initiatives.

A study examining the dynamics of paid and volunteer open-source developers within the Rust project has revealed significant disparities in their contribution behaviors [43]. Notably, core developers who receive compensation demonstrate a higher frequency of contributions compared to volunteers <sup>8</sup>. This suggests that financial incentives may play a role in driving sustained engagement.

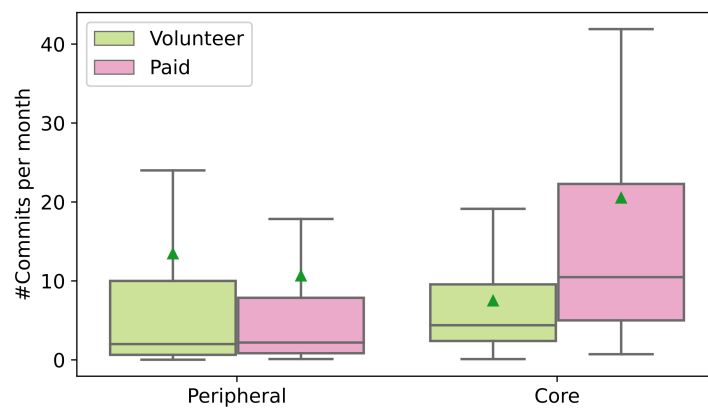


Figure 8: How often paid and volunteer developers contribute to Rust project [43]

Moreover, commits from one-time paid developers tend to be larger in scope, potentially encompassing more impactful code changes than those of one-time volunteers. This highlights a possible correlation between compensation and the magnitude of contributions. Peripheral paid developers exhibit a higher inclination towards implementing new features compared to unpaid contributors. This trend underscores how financial incentives might influence not only the quantity but also the innovative nature of contributions within the open-source ecosystem.

Collectively, these findings illustrate the complex dynamics of mixed-motivation OSS projects. Understanding these distinctions is crucial for project maintainers seeking to effectively leverage the collaborative potential of both paid and volunteer contributors, ultimately strengthening the sustainability of OSS projects.

#### 4. Role transformation

One of the defining characteristics of OSS projects is the transformation of roles. Unlike traditional software development models, where users and developers occupy distinct positions, OSS communities blur these lines. Anyone, from seasoned developers to individuals

with technical curiosity, can become a contributor. This inclusive nature fosters a sense of ownership and empowers users to actively shape the project's evolution. The potential to transition from user to developer offers a compelling incentive for participation, fostering a community where everyone's voice is valued, and diverse perspectives are encouraged.

Furthermore, the ability to directly address user needs serves as a significant motivator for developers to contribute to open-source projects. Whether these needs arise from professional or personal endeavors, developers within the OSS community are driven by the desire to create software that solves real-world problems and enhances the user experience. This direct connection between developers and users fosters a collaborative environment where both parties benefit from the shared knowledge and dedication to continuous improvement.

## 6.2 RQ2: Impact of social dynamics

In addition to investigating the motivations of developers, this research also examined the significant influence of social dynamics on the participation of developers in open-source projects. Through a comprehensive analysis of 13 pertinent studies selected from a pool of over 20 papers, this research has yielded several key findings. These findings highlight the multifaceted nature of developer engagement in open-source initiatives and underscore the importance of social interactions in shaping participation patterns. The subsequent sections will elaborate on these findings, providing a nuanced understanding of the interplay between individual motivations and social forces within the open-source software development ecosystem.

### 6.2.1 Community interaction

The level of interaction within an open-source community is a significant determinant of developer participation. Active communication channels, encompassing forums, mailing lists, and chat platforms, provide essential avenues for collaboration, knowledge sharing, and mutual assistance. These interactions foster a sense of community and belonging, encouraging developers to actively engage with the project and contribute their expertise. Conversely, projects with limited or ineffective communication channels may struggle to attract and retain contributors, as developers may feel isolated or lack the necessary support to make meaningful contributions.

Empirical research consistently demonstrates that developers derive substantial satisfaction from collaborative endeavors and the opportunity to assist others within the open-source ecosystem. Collaboration and teamwork are not merely instrumental means to achieve project goals but are also intrinsically rewarding for developers. The sense of community engendered by open-source projects, along with the opportunity to interact with peers and

contribute to a shared endeavor, are integral to the ethos of open-source software development.

The establishment of robust communication infrastructure and feedback mechanisms is paramount for sustaining active developer participation. Clear, transparent, and efficient communication facilitates the resolution of technical issues, the exchange of innovative ideas, and the coordination of efforts among team members. Moreover, constructive feedback loops enable developers to learn from each other, refine their skills, and enhance the quality of their contributions. Cultivating a supportive and communicative environment fosters a sense of camaraderie and shared purpose, thereby augmenting developer engagement and productivity.

The integration of social features within open-source platforms, such as mechanisms for connecting individuals seeking assistance with those willing to provide it, can substantially enhance community interactions and support. The open-source ethos is intrinsically predicated on collaboration and the open exchange of knowledge, and social platforms facilitate these interactions by creating virtual spaces for developers to connect, communicate, and collaborate. The sense of belonging to a community of like-minded individuals fosters camaraderie, mutual assistance, and a shared sense of purpose, all of which contribute to sustained engagement and project success.

The presence of experienced developers who are willing to mentor newcomers is a crucial catalyst for promoting participation and retention within open-source communities. Mentorship programs provide novice developers with invaluable guidance, support, and encouragement, empowering them to overcome challenges, acquire new skills, and integrate seamlessly into the community. This intergenerational transfer of knowledge is essential for the long-term sustainability and growth of open-source projects. By fostering a welcoming and inclusive environment that values mentorship and knowledge sharing, open-source communities can attract and retain a diverse range of contributors, ensuring the continued vitality and innovation of the open-source software ecosystem.

### 6.2.2 Networking opportunities

Novice contributors often transition their initial motivations towards career-oriented goals, leveraging open-source projects as a portfolio to showcase their skills to potential employers [5, 14]. Participation in these projects offers invaluable networking opportunities, fostering connections with industry professionals and paving the way for career advancement [41, 14, 25]. By demonstrating their expertise and building a reputation within the open-source community, developers can attract job offers, consulting opportunities, and further professional

development. Moreover, the open-source environment allows developers to gain experience with diverse technologies, tools, and methodologies, broadening their skillset and making them more adaptable to the evolving demands of the tech industry.

Open-source projects serve as a platform for developers to connect with industry peers, experts, and potential employers [41, 14, 25]. These connections can lead to collaborations on new projects, expanding professional networks and opening doors to career growth opportunities. The collaborative nature of open-source projects allows developers to establish relationships with like-minded individuals, fostering a supportive community that encourages knowledge sharing and mutual growth. Additionally, engaging with established open-source communities can provide developers with exposure to industry best practices, coding standards, and project management methodologies, further enhancing their professional capabilities.

Open-source projects are inherently collaborative environments, providing developers with ample opportunities to share knowledge, learn from others, and enhance their skills. The exchange of ideas, feedback on code, and exposure to diverse perspectives within the community foster continuous learning and skill improvement. Through interactions with other developers, mentorship, and exposure to new ideas and technologies, developers are motivated to stay engaged and contribute to the project's ongoing success [5, 42, 23, 25]. This culture of continuous learning and knowledge sharing also helps developers stay abreast of the latest trends and innovations in the tech industry, ensuring their skills remain relevant and in demand.

### 6.2.3 Community culture and support

Engaged and supportive open-source communities act as a catalyst for developer contributions by offering assistance, constructive feedback, and a sense of belonging. This collaborative atmosphere nurtures knowledge sharing, mutual support, and a strong sense of community among developers. Ultimately, positive social interactions and a supportive environment within these communities drive increased motivation and sustained engagement among developers. [41, 7, 25, 21].

Social coding platforms have revolutionized the open-source landscape, shifting the culture from its traditional hacker-centric roots to a more inclusive, collaborative community. By lowering barriers to entry, these platforms have made open-source projects more accessible and welcoming to newcomers, regardless of their technical expertise [42, 14]. They foster a sense of belonging and encourage participation through features like issue tracking, discussion forums, and code review tools, promoting knowledge sharing and collaborative

problem-solving. This cultural shift has not only broadened the pool of contributors but has also led to more diverse perspectives and innovative solutions within the open-source ecosystem.

Roles within OSS communities are dynamic and fluid, allowing members to assume greater responsibilities by contributing meaningfully to projects. As individuals transition between roles, they actively influence the social dynamics and structure of the community, ultimately driving its evolution [42]. This flexibility enables OSS communities to adapt and thrive in response to the evolving needs of projects and the diverse contributions of their members.

Open-source platforms that promote collaboration and offer diverse avenues for appreciation, ranging from formal accolades to informal gestures like awarding stars to projects, significantly enhance the sense of belonging and recognition among community members. Active engagement in these communities allows developers to gain recognition for their contributions, cultivate a positive reputation, and establish a personal brand within the wider developer community [14, 25].

The paper “OpenRank Leaderboard: Motivating Open Source Collaborations Through Social Network Evaluation in Alibaba” presents a study conducted to explore the impact of the OpenRank Leaderboard on open source collaborations within Alibaba’s projects [44]. The research methodology involved a mixed-methods approach, including case studies, surveys, analysis of project metrics data, semi-structured interviews, and thematic coding. The study focused on seven open source projects initiated by Alibaba, aiming to investigate how gamified leaderboards can motivate collaboration and drive innovation in software development.

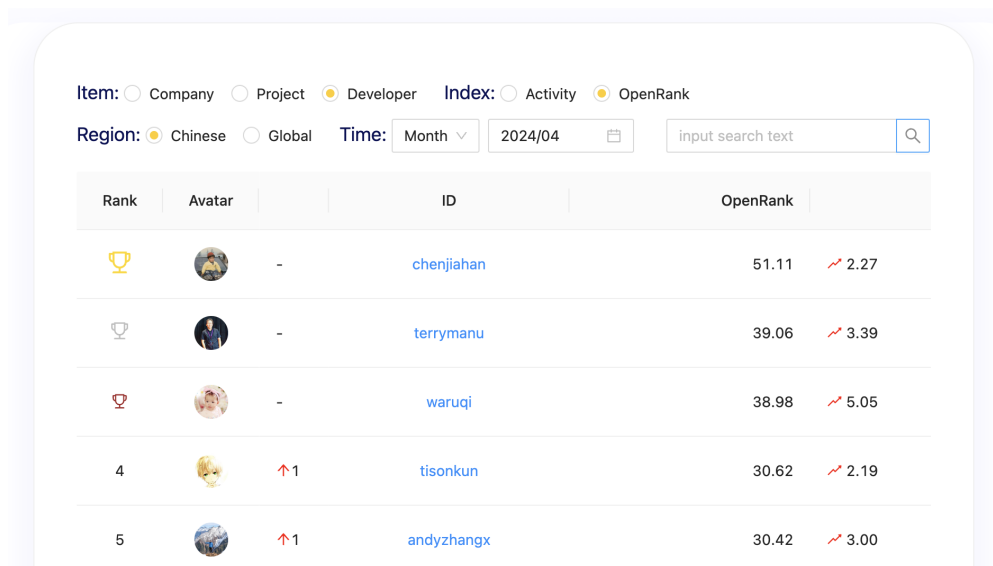


Figure 9: A screenshot of the interface of the OpenRank Leaderboard in May, 2024

Through the implementation of the OpenRank Leaderboard, the study found that developers were motivated to engage in more transparent communication, leading to improved collaboration behavior and a better community atmosphere. The leaderboard incentivized developers to make smaller, independent Pull Requests (PR) and avoid direct commits to the repository, ultimately enhancing the quality of code contributions and fostering continuous improvement within the projects. The research also highlighted the role of the leaderboard in promoting healthy competition among developers, encouraging sustained engagement, and driving innovation within the open source projects.

The findings of the study indicated that the OpenRank Leaderboard effectively evaluates and steers developers' contributions, leading to positive behavioral changes and enhanced collaboration habits. Developers expressed a favorable perception of using graph network algorithms for contribution evaluation, with many acknowledging the alignment of rankings with their community perceptions and the value of combining results with community incentive operations. Overall, the study contributes valuable insights into the impacts and perceptions of using leaderboards as a gamification mechanism in company-led open source projects, emphasizing the importance of social network evaluation in motivating open source collaborations and driving innovation in software development.

### 6.3 RQ3: Contribution barriers

Beyond examining the motivations and social dynamics that propel developer participation in open-source projects, this research also delved into the barriers hindering their contributions. Through an analysis of five selected studies, several key challenges were identified that impede developer engagement and limit their ability to contribute effectively. The following sections will explore these barriers in detail, providing a comprehensive overview of the obstacles developers face in the open-source software development landscape. Based on a previous study by Mariam [17], the barriers to contribution were categorized into three main categories: technical challenges, social challenges, and process challenges. Each category encompasses distinct obstacles that hinder developer participation and require targeted interventions to overcome.

#### 6.3.1 Technical challenges

A significant technical barrier to open-source contribution is the lack of technical background and domain expertise among potential contributors. Without a foundational understanding of the project's technological underpinnings, whether it's a specific programming language, framework, or software architecture, individuals may struggle to effectively engage and contribute to its development. Additionally, a lack of domain expertise in the subject matter the

project addresses can hinder understanding of the problem space and the proposed solutions, making it difficult to provide meaningful contributions.

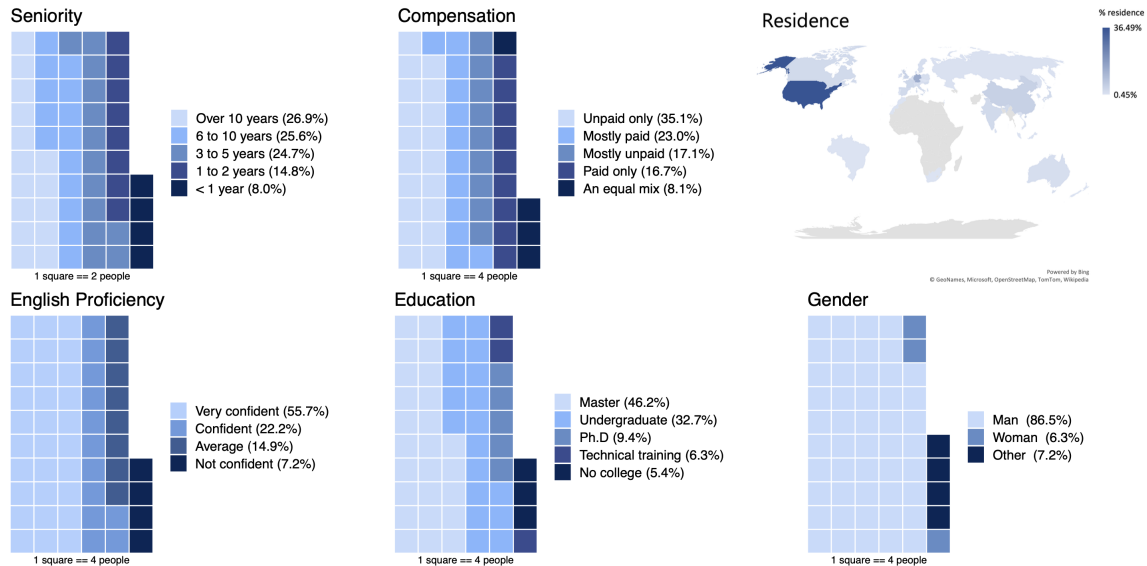


Figure 10: The background of the 223 developers from Apache Software Foundation [17]

The diversity of programming languages used within and across open-source projects presents another challenge. Many projects utilize multiple languages for different components, and the open-source ecosystem as a whole encompasses a vast array of programming languages. Contributors often need to familiarize themselves with these languages to effectively understand and modify code, which can be daunting and time-consuming, particularly for those with limited programming experience or those accustomed to a single language.

Becoming a contributing member of an OSS project often entails acquiring project-specific skills, a process that can span months to a year. This temporal investment is highlighted in Bird [4] analysis of three OSS projects, where the median duration for newcomers to submit their initial patch and subsequently gain acceptance was revealed. This underscores the significant commitment required to successfully integrate into and contribute to OSS projects. The figure 11 illustrates the time required to learn skills particular to a project, emphasizing the steep learning curve faced by newcomers.

Discrepancies in technical skills and knowledge backgrounds among contributors can create a challenging environment for newcomers [39]. Open-source projects often attract individuals with varying levels of expertise, from seasoned developers to those just starting their coding journey. Navigating a project with such diverse skill levels can be intimidating, making it difficult for newcomers to find their footing, ask questions without feeling inadequate, and contribute meaningfully.



OSS project	Median time after the first email to the mailing list until ...	
	... first patch submission	... first patch acceptance
Postgres	2. month	3. month
Apache	2. month	10. month
Python	6. month	13. month

Figure 11: Time required to learn skills particular to a project [4]

Inadequate or outdated project documentation further compounds the challenges faced by contributors. Clear, comprehensive, and up-to-date documentation is crucial for understanding the project’s codebase, workflow, and contribution guidelines. It serves as a roadmap for new contributors, guiding them through the project’s intricacies. Without well-maintained documentation, newcomers may struggle to locate the correct areas for modification, understand the reasoning behind existing code, and follow established conventions, ultimately hindering their ability to contribute effectively to the project’s development.

### 6.3.2 Social challenges

Effective communication is paramount in the open-source landscape, yet it is often fraught with challenges that can impede participation and collaboration. Limitations in the available communication tools, such as reliance on text-based platforms or asynchronous communication channels, can hinder real-time interaction and create misunderstandings. Additionally, diverse communication styles among members, ranging from direct and concise to more elaborate and nuanced, can lead to misinterpretations and impede the development of shared understanding. Moreover, conflicting viewpoints and disagreements within the community, while natural, can escalate into unproductive debates that alienate newcomers and create an unwelcoming environment.

The social dimension of open-source projects is equally crucial, as it fosters a sense of belonging and encourages collaboration. However, newcomers often encounter difficulties establishing connections with project members, particularly in large and established communities. This can lead to feelings of isolation and a lack of mentorship or guidance, making it challenging to navigate the project’s intricacies and identify suitable contribution opportunities. Moreover, if newcomers perceive a lack of responsiveness or support from existing members, their enthusiasm may wane, and they may ultimately abandon their efforts.

The responsiveness of the community is a critical determinant of newcomers’ experiences and long-term engagement. When individuals feel that their questions are ignored, their con-

tributions are not acknowledged, or their efforts are not valued, they may become demotivated and disengage from the project. Conversely, timely feedback, recognition, and support can boost morale and encourage continued participation. Therefore, fostering a culture of responsiveness and inclusivity is essential for attracting and retaining new contributors.

Cultural aspects, often overlooked but equally significant, can also create barriers for newcomers seeking to integrate into the project community. Different cultural backgrounds and norms can lead to varying expectations regarding communication styles, decision-making processes, and interpersonal interactions. These differences can create misunderstandings and misinterpretations, hindering the establishment of rapport and trust between newcomers and existing members. Additionally, the initial reception and onboarding process for newcomers can significantly impact their experience and willingness to contribute. A welcoming and supportive environment, with clear guidelines and mentorship opportunities, can make a substantial difference in fostering a sense of belonging and encouraging long-term participation.

### 6.3.3 Process challenges

Embarking on a journey to contribute to open-source projects can often feel like navigating a complex maze. The path is riddled with challenges, particularly for newcomers who are unfamiliar with the unique ecosystem of each project. Understanding the specific workflow, which can vary significantly between projects, is a critical first step. This includes grasping the nuances of branching strategies, pull request etiquette, and the overall development cycle. Additionally, mastering version control systems like Git, with its array of commands and concepts, can be a steep learning curve.

Adherence to coding standards and contribution guidelines is another significant hurdle. Each project has its own meticulously crafted conventions and best practices, often accumulated over years of development. Failing to comply with these standards can lead to rejected contributions or frustrating delays in getting changes merged. For newcomers, who are still acclimating to the project's culture and technical requirements, this can be a discouraging experience.

Compounding these challenges is the frequent lack of comprehensive and user-friendly onboarding materials. While some projects may boast extensive documentation, it is often not tailored for newcomers or may be outdated, leaving crucial information buried or irrelevant. The absence of step-by-step tutorials that walk newcomers through the contribution process, clear explanations of the project's architecture and codebase, or readily available mentorship programs can leave them feeling lost and overwhelmed. This lack of guidance

not only discourages potential contributors but also hinders their ability to make meaningful contributions, ultimately depriving the project of valuable talent and fresh perspectives.

Moreover, the sheer size and complexity of some open-source projects can be intimidating for newcomers. With vast codebases, numerous contributors, and a long history of development, it can be difficult to know where to start or how to make a meaningful impact. The lack of a structured onboarding process, coupled with the fear of making mistakes or not understanding the project's intricacies, can create a sense of paralysis and prevent newcomers from taking that crucial first step.

## 7 Conclusion

The study delves at the complex terrain of open-source software development, focusing on the diverse motives that lead people to contribute to these projects. Using Kitchenham's approach as a guide, a thorough SLR was carried out, methodically reviewing current data to find the many aspects driving developer engagement. This study dives into the social effects, problems, and underlying motives of the open-source software community through an analysis of a carefully chosen collection of 20 relevant publications. The thesis aims to shed light on the intricacies of developer behavior in open-source projects, uncover gaps in existing theoretical frameworks, and lay the groundwork for future research in this dynamic and ever-changing subject.

### 7.1 Finding

The study reveals a multifaceted array of motivations, both intrinsic and extrinsic, that propel developers to participate in open-source projects. These motivations serve as critical drivers in shaping the level of involvement and commitment demonstrated by developers within collaborative software development endeavors.

Furthermore, the research emphasizes the profound impact of social dynamics on developer participation. Factors such as the quality of community interactions, the availability of networking opportunities, and the overall sense of belonging within the community play a pivotal role in fostering engagement and contributing to project success. Nurturing these social environments is therefore crucial for promoting sustained participation and achieving optimal outcomes within the open-source community.

The thesis also sheds light on the various barriers and challenges that developers encounter in open-source projects. These obstacles can be technical, social, or process-related in nature. By examining the strategies and solutions employed by developers to navigate these challenges, the study underscores their resilience and adaptability in ensuring continued participation despite the hurdles they face.

By delving into the interplay between technology and human behavior, this research highlights the pivotal role of human elements in shaping the adoption, utilization, and evolution of open-source software. Understanding these human factors, including motivations, social dynamics, and challenges, is essential for developing effective software product management strategies and fostering innovation within the software development landscape.

## 7.2 Implications

The insights derived from this study offer significant implications for software product management and open-source software development. By elucidating the diverse motivations that drive developer participation, software product managers can refine their strategies to attract and retain high-performing individuals within their organizations. Recognizing the pivotal role of social dynamics in open-source projects can empower managers to cultivate collaborative environments that nurture creativity, innovation, and knowledge sharing among team members, ultimately enhancing productivity and project outcomes.

Furthermore, this research sheds light on the barriers and challenges that developers encounter in open-source projects, providing valuable information for software product managers to develop targeted interventions. These interventions may encompass training initiatives, resource allocation, or mentorship programs aimed at empowering developers to overcome technical hurdles, enhance communication skills, and navigate the complexities inherent in open-source development. By addressing these challenges proactively, managers can create a more supportive and inclusive environment that fosters developer growth and maximizes their contributions.

In addition to its practical implications for software product management, this study also serves as a catalyst for future research in the field of open-source software development. By highlighting the limitations of current research and theoretical frameworks, it paves the way for further exploration into the intricate interplay of motivations, social dynamics, and challenges that shape developer behavior in open-source projects. Future research can build upon these findings to develop more comprehensive and nuanced models that capture the complexities of developer engagement, leading to a deeper understanding of this dynamic landscape and informing more effective strategies for fostering a thriving open-source community.

## 7.3 Limitations

The insights derived from this study, while valuable, are inherently constrained by several factors. Firstly, the scope of the literature review, while systematic, focused on a curated selection of articles. This deliberate narrowing of the research base may have inadvertently excluded relevant studies and diverse perspectives, potentially limiting the breadth of findings. Future research could broaden this scope, encompassing a wider range of sources to provide a more comprehensive understanding of developer motivations in open source.

Secondly the generalizability of the study's conclusions may be limited due to the specific focus on a particular set of articles and studies. The findings may not fully capture the diverse spectrum of motivations and experiences that exist across the vast landscape of open-

source projects and communities. To address this, future research could employ a more expansive and inclusive approach, examining a wider variety of projects and incorporating diverse methodologies to ensure a more representative sample.

Thirdly while the systematic literature review methodology offers a structured and rigorous approach to analyzing existing research, it may not fully capture the nuances and complexities of developer motivations. Alternative research approaches, such as qualitative interviews or surveys, could provide valuable insights into the lived experiences and personal perspectives of developers, thereby enriching the understanding of the factors that drive their engagement.

Furthermore it is important to acknowledge the potential for bias and subjectivity in the interpretation of findings and conclusions. While efforts were made to mitigate these factors, the researcher's own perspectives and biases may have inadvertently influenced the analysis and interpretation of data. Future research could incorporate measures to enhance objectivity and transparency, such as employing multiple coders or utilizing standardized coding schemes.

Additionally, the dynamic nature of open-source software development and the evolving landscape of developer motivations introduce a temporal dimension to the study's limitations. The conclusions drawn from the research may be influenced by the timeframe in which the literature review was conducted. As such, future studies could revisit these questions periodically to track changes and trends in developer motivations over time.

## 7.4 Future work

Future research in the field of developer motivations in open source software development presents a plethora of opportunities to deepen our understanding of this complex landscape. Longitudinal studies could track the evolution of developer motivations over time, revealing how external factors like technological advancements or shifts in community dynamics influence participation. Cross-cultural analysis could shed light on the impact of cultural norms and values on engagement, highlighting the universality or cultural specificity of motivational factors.

In-depth qualitative interviews with developers would offer rich insights into their personal experiences, motivations, and challenges, complementing existing research and providing a more nuanced understanding of their behavior. Behavioral studies, drawing from economics and psychology, could investigate the decision-making processes and behavioral patterns within open-source communities, uncovering the cognitive processes underlying motivation and informing effective community management strategies.

Further exploration into the influence of gender and diversity factors on developer participation is crucial for addressing inclusivity challenges and fostering a welcoming environment for all. Examining the effectiveness of various incentive structures, from recognition programs to monetary rewards, could offer valuable insights into motivating sustained contributions. Additionally, investigating the role of community dynamics, leadership styles, and governance structures could reveal how these factors shape developer motivations and engagement, informing strategies for creating collaborative and thriving communities.

The impact of emerging technologies on developer motivations and participation warrants further exploration. Understanding how advancements like blockchain or artificial intelligence influence the open-source landscape can guide the development of projects that align with evolving developer interests. Additionally, investigating the influence of educational initiatives, such as coding boot camps and mentorship programs, can shed light on how early exposure to open-source software fosters long-term engagement and contributes to a sustainable talent pipeline.

Finally, addressing the ethical considerations associated with developer motivations, such as data privacy, security, and community responsibility, is essential for ensuring sustainable and responsible software development practices. By pursuing these diverse avenues of research, we can not only enhance our understanding of the complex dynamics within open-source communities but also foster a more inclusive, innovative, and ethically conscious open-source ecosystem.

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## Appendix 1 Selected articles and papers for SLR

Table 5: Articles and papers selected for SLR.

Article ID	Title	Authors	Y.O.P
A01	A systematic literature review on the barriers faced by newcomers to open source software projects	Steinmacher, I., Silva, M. A. G., Gerosa, M. A., & Redmiles, D. F.	2015
A02	Social barriers faced by newcomers placing their first contribution in open source software projects	Steinmacher, I., Conte, T., Gerosa, M. A., & Redmiles, D.	2015
A03	Overcoming social barriers when contributing to open source software projects	Steinmacher, I., Gerosa, M., Conte, T. U., & Redmiles, D. F.	2019
A04	The long road ahead: Ongoing challenges in contributing to large oss organizations and what to do	Guizani, M., Chatterjee, A., Trinkenreich, B., May, M. E., Noa-Guevara, G. J., Russell, L. J., ... & Sarma, A.	2021
A05	Intrinsic motivation in open source software development	Bitzer, J., Schrettl, W., & Schröder, P. J.	2007
A06	Toward an understanding of the motivation of open source software developers	Ye, Y., & Kishida, K.	2003
A07	OpenRank Leaderboard: Motivating Open Source Collaborations Through Social Network Evaluation in Alibaba	Zhao, Shengyu	2024

A08	How Are Paid and Volunteer Open Source Developers Different? A Study of the Rust Project	Zhang, Yuxia	2024
A09	Why hackers do what they do: Understanding motivation and effort in free/open source software projects	Lakhani, K. R., & Wolf, R. G.	2005
A10	An empirical analysis of open source software developers' motivations and continuance intentions	Wu, C. G., Gerlach, J. H., & Young, C. E.	2007
A11	The shifting sands of motivation: Revisiting what drives contributors in open source	Gerosa, M., Wiese, I., Trinkenreich, B., Link, G., Robles, G., Treude, C., ... & Sarma, A.	2021
A12	The characteristics and motivations of library open source software developers: An empirical study	Choi, N., & Pruett, J. A.	2015
A13	Leadership characteristics and developers' motivation in open source software development	Li, Y., Tan, C. H., & Teo, H. H.	2012
A14	On the relationship between newcomer motivations and contribution barriers in open source projects	Hannebauer, C., & Gruhn, V.	2017
A15	Understanding the motivations, participation, and performance of open source software developers: A longitudinal study of the Apache projects	Roberts, J. A., Hann, I. H., & Slaughter, S. A.	2006
A16	Motivations for participating in open source software communities: Roles of psychological needs and altruism	Ke, W., & Zhang, P.	2008

A17	Working for free? Motivations for participating in open-source projects	Alexander Hars, S. O.	2002
A18	Exploring motivations for contributing to open source initiatives: The roles of contribution context and personal values	Oreg, S., & Nov, O.	2008
A19	Community dynamics in open source software projects: Aging and social reshaping	Hannemann, A., & Klamma, R.	2013
A20	The material and social dynamics of motivation: Contributions to Open Source language technology development	Freeman, S.	2007