Analysing Socio-technical Congruence in the Package **Dependency Network of Cargo**

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ABSTRACT

Software package distributions form large dependency networks maintained by large communities of contributors. My PhD research will consist of analysing the evolution of the socio-technical congruence of these package dependency networks, and studying its impact on the health of the ecosystem and its community. I have started a longitudinal empirical study of Cargo's dependency network and the social (commenting) and technical (development) activities in Cargo's package repositories on GitHub, and present some preliminary findings.

CCS CONCEPTS

 Human-centered computing → Empirical studies in collaborative and social computing.

KEYWORDS

Socio-Technical congruence, Software ecosystem, Software repository mining, Software development, Package dependency network

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1 INTRODUCTION

Today's software development is increasingly relying on software package libraries distributed through open source software (OSS) package managers (such as Cargo, npm, Maven and CRAN). Rather than writing software from scratch, developers often choose to depend on existing software packages. At the same time, collaborative online development platforms like GitHub make software development an inherently social phenomenon [8, 21].

The collection of packages distributed by a software package manager forms a socio-technical dependency network. Packages depend on other packages that are required for installing and deploying them. Software developers are *technically* contributing to these packages (e.g., by making commits, pull requests to the package's git repository). Software developers are also socially active

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(e.g., by commenting on the commit and pull request activities). The phenomenon of socio-technical congruence (a.k.a. Conway's law) [7, 13] assumes that the package dependency network structure and the communication structure of its community of contributors are tightly interwoven. Very little research focuses on such sociotechnical congruence at the ecosystem level [22], or studies show the congruence evolves over time [5].

My PhD research aims to empirically study, within evolving OSS ecosystems, the socio-technical congruence between package dependencies, the interaction patterns of package contributors and how this affects the health of the ecosystem. To do so I will explore 3 research questions: \mathbf{RQ}_1 How does the dependency network structure influence social activity? \mathbf{RQ}_2 How does the social activity of package contributors increase their likelihood to start/stop depending on this package? **RO**₃ How does the social activity of package contributors increase their likelihood to start/stop becoming technically active?

In the first phase, I will focus on packages distributed through the Cargo package manager and developed on GitHub by studying their technical development activity (e.g., GitHub commits and pull requests) and social communication activity (e.g., commit comments and pull requests comments). Other activity types and packaging ecosystems will be explored in a later phase, on the basis of the results obtained in the first phase. These questions will focus on the expected benefits that socio-technical congruence will have on the health of the ecosystem and its community, such as increased productivity, responsiveness, contributor intake and retention.

2 BACKGROUND

Software ecosystems are large collections of interconnected software components with complex socio-technical interaction patterns [19, 20]. Typical well-studied ecosystems are software library registries [9, 11, 15] (e.g., npm, PyPI, RubyGems, Maven, Cargo) allowing to reuse software libraries for specific programming languages. Their technical dependency networks grow at a rapid pace and may contain fragile packages that have a high transitive impact [10]. Ecosystem-specific policies, values and technical choices play an important role in how such networks evolve over time [4].

Social issues are at least as important as technical ones. Social coding platforms can lead to effective work coordination strategies [8] and have become indispensable collaborative environments for software ecosystems [13]. Researchers have studied the social aspects of how developer teams interact and evolve [18], how newcomers progress in a software project [25, 26], how the core team grows over time [23], how developer teams get renewed [6], and how socio-technical patterns affect software success or failure [24].

Social and technical issues are tightly interwoven and should be addressed conjointly, because of Conway's law stating that the

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software structure mimicks the communication and coordination structure of the community developing it [3, 7, 13, 17]. New models are required to better understand such socio-technical congruence at the ecosystem level [22]. In addition, the temporal dimension needs to be taken into account since the contributor and technical relationships evolve over time [5]. Combining social and technical information leads to better prediction models, for example to detect faults in software components [1, 2], to predict if a project participant will become a developer [12], and to recommend experts [16].

3 DATA EXTRACTION AND ANALYSIS

The libraries.io monitoring service contains package metadata, including dependencies for 36 different package managers. I have selected the Cargo package manager for the Rust programming language as a first case study. It was created in 2014, and most of its packages are developed on GitHub. Cargo is growing fast in number of packages, package releases, dependencies and contributors [10].

I used on a datadump of libraries.io [14] to extract the temporal evolution of Cargo's package dependency network. For each package, I extracted the package name, release number and date, maintainer, package dependencies and their versioning constraints. The dataset contained +15*K* packages, +66*K* package releases and +48*K* dependency relations. I retrieved the (optional) link to the corresponding development repositories. I downloaded the relevant historical socio-technical data from their GitHub repositories. This data includes all contributors and their role, the *social* commenting activities they were involved in (+904*K* comments), and the *technical* development activities they had conducted (+942*K* commits, +145*K* pull requests and +266*K* issues). 3,170 repositories had no comments, and comments follow the Pareto rule (80% of all comments belong to < 20% of all repositories).

To study the socio-technical congruence of Cargo, I am analysing its package dependency network and the associated technical and social activities of its contributors. I report some preliminary anecdotal results below. They need to be complemented with proper statistical hypothesis testing, regression and survival analysis, and prediction modeling. I started to investigate how the presence of commenting activity in a package repository relates to the introduction of dependency to that package. To do so, I considered all packages in which a new dependency was added, and analysed whether commenting activity could be observed in the target package repository before or after depending on it. Figure 1 summarises the results. One can observe that in more cases commenting activity started after depending on that package. An important shift in behaviour can be observed since September 2016, where the number of packages with commenting activity before starting to depend on them is increasing and even exceeds in September 2017 the number of packages with commenting activity after starting to depend on them. Why this occurs remains an open question for now.

In order to assess which types of comments (i.e., commit comments, issue comments, pull request comments or pull request review comments) are more likely to lead to the introduction of new package dependencies, I analysed their relative proportion in repositories prior to the addition of a dependency toward those packages. Figure 2 presents these results. Among the four types of comments, the proportion of comments on pull requests and



Figure 1: Number of package repositories with first commenting activity *before* or *after* starting to depend on a package.



Figure 2: Proportion of comment types made in the repositories of packages before starting to depend on that package.



Figure 3: Number of cases with comment activity (by comment type) before starting to technically contribute to a package.

issue requests is considerably higher than for commit comments and pull request review comments. I hypothesise that commenting on pull requests and issue requests for a package could serve as a good predictor for adding new dependencies to that package. More detailed statistical analyses are needed to confirm this hypothesis.

I also started to investigate whether social (i.e., commenting) activity on a package repository increases the likelihood to become technically active on that repository (i.e., submitting commits or pull requests). Figure 3 presents some preliminary results. Considering the four comment types, issue comments appear to be more likely to result in becoming technically active on a package repository. The figure shows the number of observations in which the contributor had a type of comment activity on the package before starting to contribute to it.

4 CONCLUSION

Given that my PhD research project just started, I only have preliminary results about the evolution of the socio-technical congruence of the Cargo packaging ecosystem. During my PhD studies I intend to gain a deeper understanding of the dynamics of this phenomenon, and complement this by studying the expected benefits on the ecosystem's health, such as increased popularity, productivity, responsiveness, contributor intake and retention. I intend to conduct similar studies on other packaging ecosystems, in order to compare their socio-technical congruence and the effect of ecosystem-specific policies and values.

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