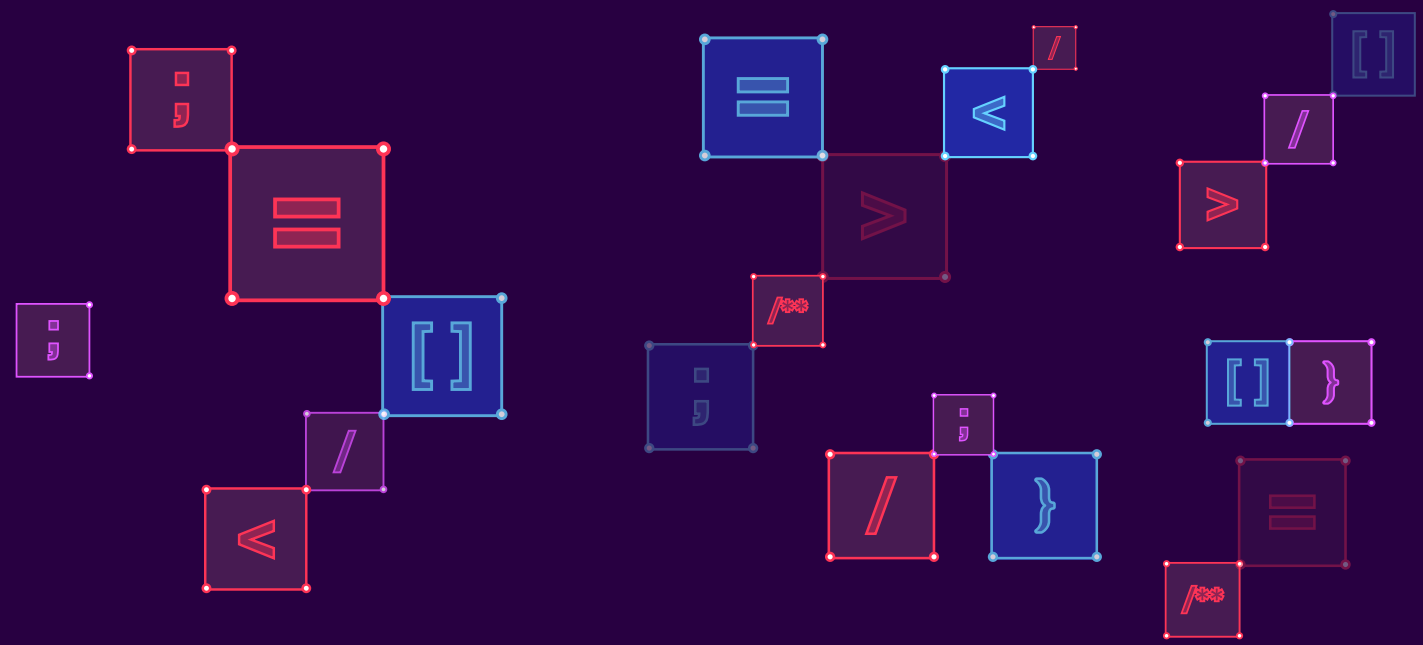
sonar

2023

the cost attributed to code-level technical debt

and how Clean as You Code avoids it



executive summary

Issues in code accumulate over time and can contribute to code-level technical debt. Technical debt leads to lower product quality, increased security risks, reduced developer velocity, efficiency, and morale. Based on an examination of more than 200 projects within a span of 12 months, our research was able to estimate the cost attributed to accumulated code-level technical debt. The study also proposes an alternate way to avoid these costs upfront.

> ***The cost attributable to code-level technical debt over 5 years for a typical project size of 1M Lines of Code (LoC) is estimated at 27,500 developer hours or $1.5M.***

This cost is vast when compounded with an organization's rapidly growing number of projects. Organizations can avoid the cost of bad code with an alternative Clean as You Code approach.

the methodology

Research[1] estimates that developers spend 33% of their time dealing with technical debt, equating to productivity loss and a significant cost to companies annually. Over and above this direct developer cost, the negative impact of technical debt can result in lower product quality, increased security risks, worsening business results, and reduced developer velocity, efficiency, and morale.

Companies choose to tackle technical debt in different ways. One approach is to do nothing or defer action until a later point. This approach, if continued, could eventually require significant refactoring or a complete rewrite of the software. The danger here is that debt accumulates, compounding complexity and potentially exacerbating the impact of code-level issues on the software. As development teams churn, addressing historical issues created by someone else can also lead to greater difficulty, complexity, and frustration.

The methodology proposed by Sonar presents an alternative approach. The Clean as You Code method prevents bad code from reaching production in the first place. It involves focusing on addressing issues in the code that is added or changed so that this code is free from all issues. When all new code is clean, the overall technical debt does not increase, and in fact, progressively reduces over time.

We conducted experiments to estimate the cost attributed to code-level technical debt and provide a quantified directional value of the approach.

This report outlines the process and results.

[1] The Developer Coefficient by Stripe

what is code-level technical debt?

Code-level technical debt refers to the accumulation of unresolved issues during software development. These issues, intentionally or unintentionally left unaddressed, result in future rework and gradually build up over time.

Technical debt generally presents itself differently for every product and company – making it challenging to quantify and compare. It is often a result of excessive software complexity, design flaws, or weak architecture. However, code level technical debt has specific quantifiable characteristics that present opportunities for analysis.

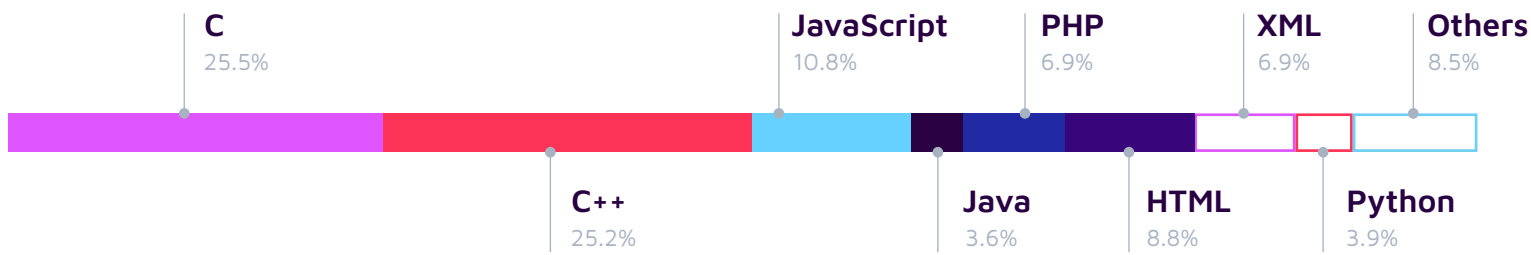
Acknowledging that coding issues are an inevitable part of development, we must recognize that the accumulation of these unresolved issues worsens the impact of code-level technical debt. Addressing these issues becomes more complex and burdensome as time passes, adversely affecting the overall software quality and developer velocity.

our research

We created a quantitative model consisting of a sample set of over 200[2] projects of varying sizes and programming languages to examine the value of employing the Clean as You Code methodology. This distribution enabled us to gather a comprehensive dataset for analyzing the volume and type of issues created over a defined period.

The data extracted totaled approximately 11M Lines of Code (LoC) and covered a variety of programming languages over 12 months. Of the projects analyzed, 27% contained multiple languages, and the average size of projects analyzed was approximately 500K LoC. The chart below illustrates the breakdown by primary language.

SAMPLED PROJECTS CATEGORIZED BY LANGUAGE



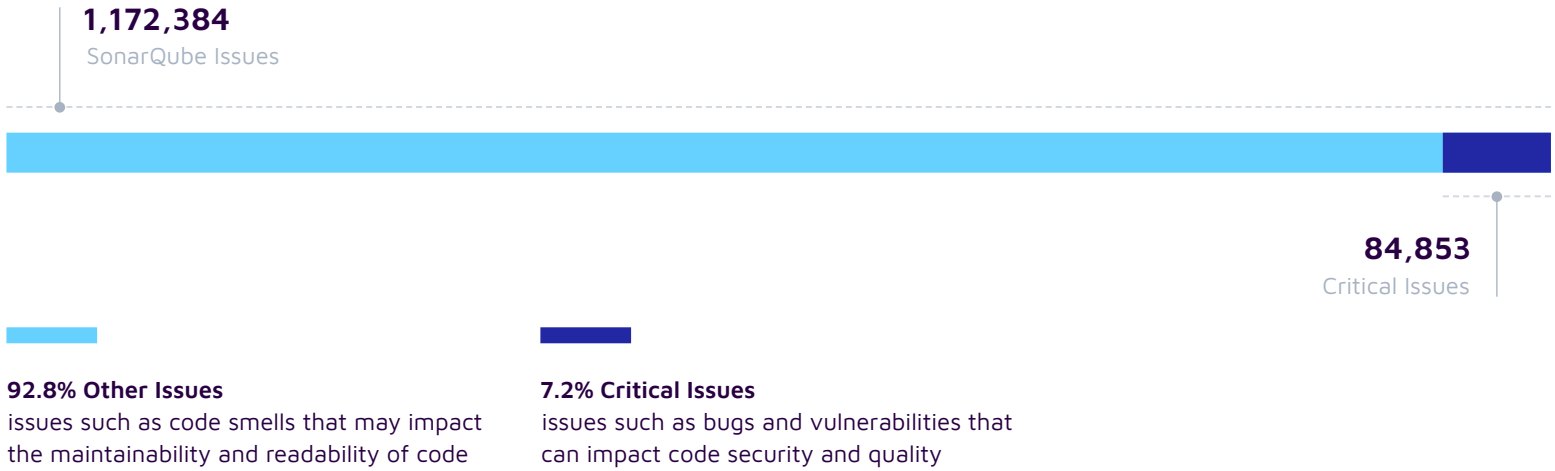
[2] A list of projects analyzed is available here

analysis of newly created issues

The extracted dataset was analyzed using SonarQube (a self-managed code analysis offering from Sonar), which delivered a view of newly created issues per month per project for 12 months.

While it is impractical to describe a typical average project (since it can vary for every organization), the data presented in this report can serve as a guide to estimate the cost associated with accumulated technical debt based on the number of projects and typical project size.

Analysis of the data portrayed a split between issues classified as "critical" and "others." Critical issues block forward progress and manifest as bugs or vulnerabilities. The category of issues labeled as "others" represents problems in the code that require attention and, if left unattended, may potentially lead to maintainability issues or serious flaws downstream.



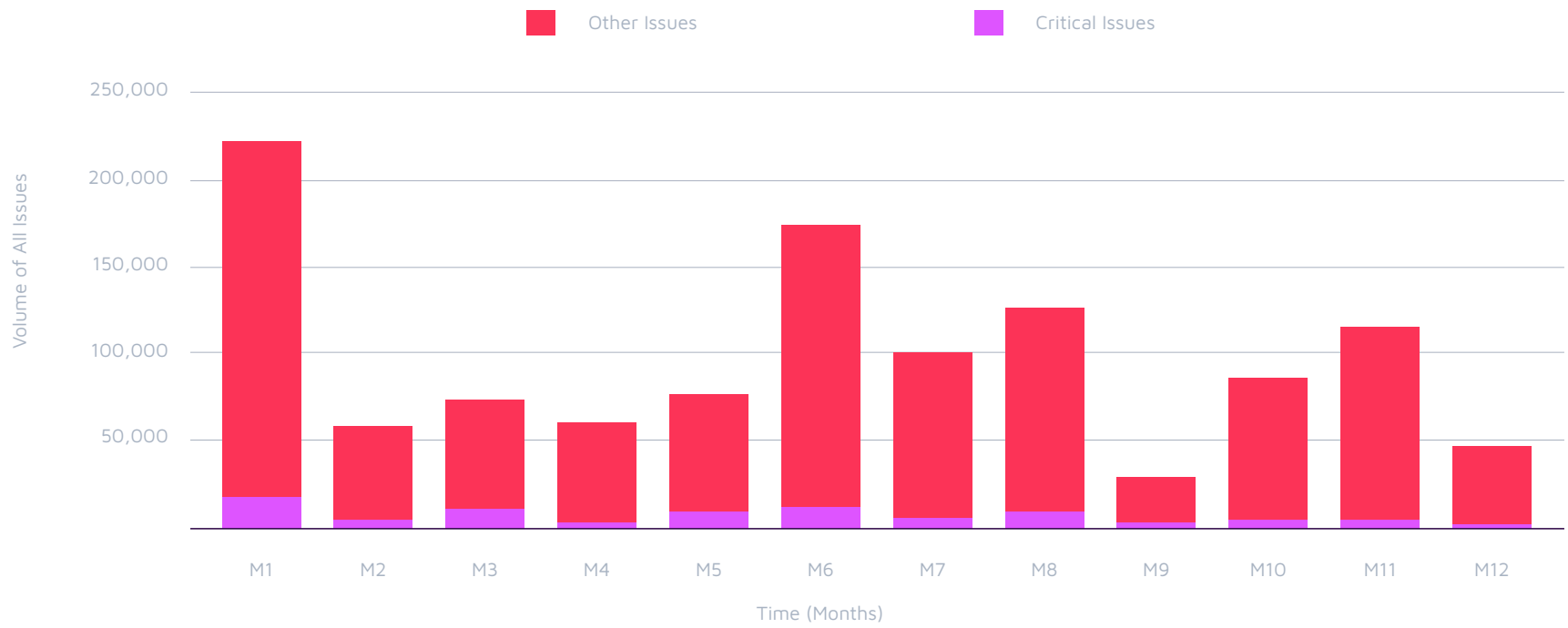
92.8% Other Issues
issues such as code smells that may impact the maintainability and readability of code

7.2% Critical Issues
issues such as bugs and vulnerabilities that can impact code security and quality

Every month, developers contribute to code-level technical debt by creating new issues. The volume of new issues created per month varied over the 12 months across all the analyzed projects. We assume that the project-specific cadence of developer effort and the subsequent merging of new code influence this.

TOTAL VOLUME OF NEW ISSUES CREATED PER MONTH

Across 200+ Projects/11M LoC



estimating the effort required to fix each issue created

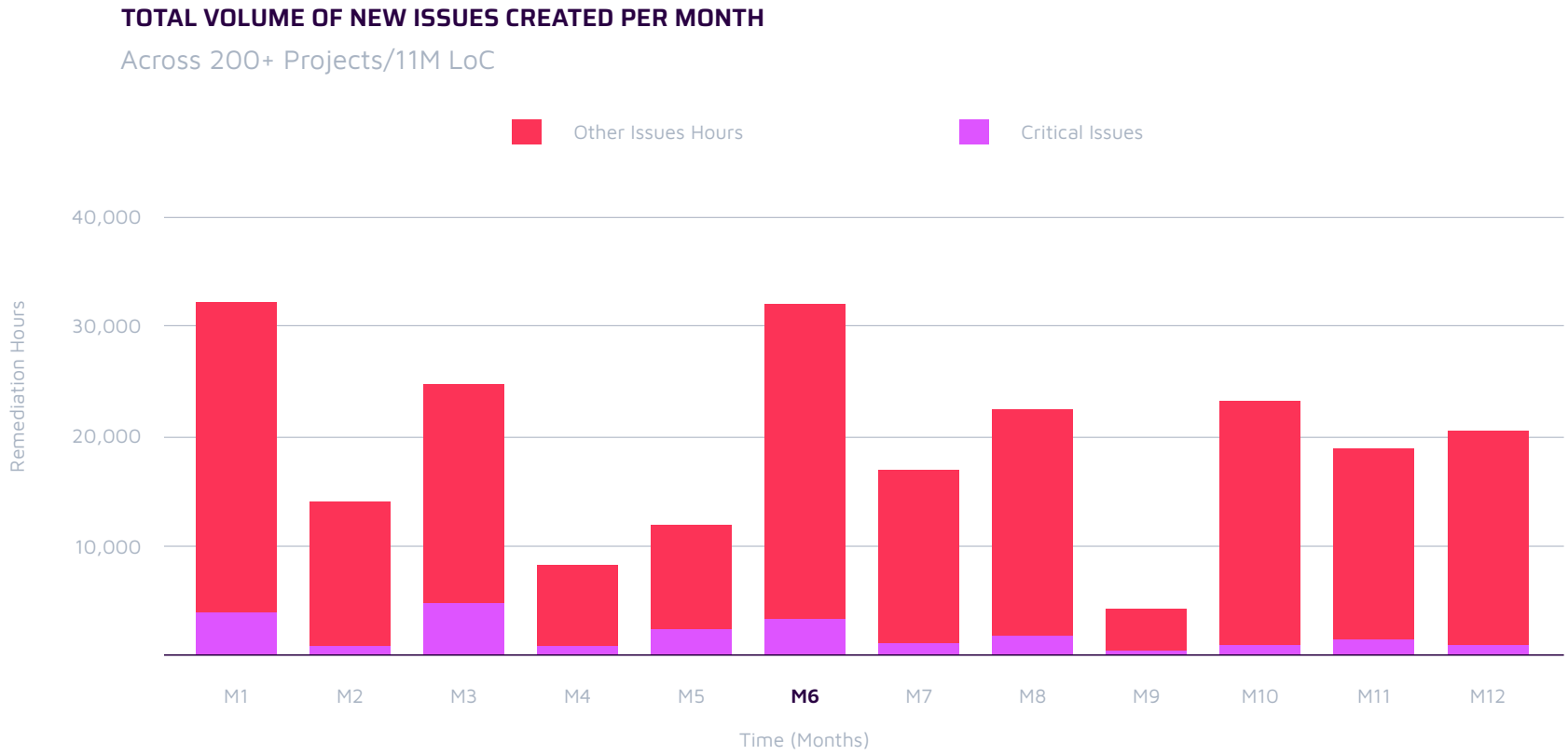
Sonar provides a publicly available library of rules to identify code issues. Each rule has an associated "Effort" or remediation time, calculated through a combination of issue classification and language[3]. Based on this data, we can compute the estimated time to fix the flagged issues. Through this analysis, we computed the approximate time to fix all reported issues to build the total estimated effort (in minutes) required to address the newly introduced issues.

EXAMPLES OF SONAR RULES AND ASSOCIATED EFFORT

Rule	Message	Type	Effort	Severity	Create Date
scala:S1764	Current one of the identical sub-expressions on both sides this operator	BUG	2 min	MAJOR	2022-06-01
csharpsquid:S5542	Use secure mode and padding scheme	VULNERABILITY	20 min	CRITICAL	2022 - 03-05
c:S984	Remove this use of dynamic memory	BUG	1 hr	CRITICAL	2022-03-08
java:S1228	Add a 'package-info.java' file to document the 'test' package	CODE SMELL	20 min	MINOR	2022-01-22
php:S1106	Move this open curly brace to the beginning of next line	CODE SMELL	1 min	MINOR	2022-07-16
java:S2658	Remove this use of dynamic class loading	VULNERABILITY	45 min	CRITICAL	2022-02-17
javascript:S930	This function expects 1 argument, but 2 were provided	BUG	10 min	CRITICAL	2022-08-30
csharpsquid:S3267	Loops should be simplified with "LINQ" expressions	CODE SMELL	5 mins	MINOR	2022-09-25

[3] Adding Coding Rules

calculating the effort to fix newly created issues



Taking **Month 6** as an example—across all the projects surveyed—there were **174k newly created issues**, which would take **32k hours to remediate** or fix.

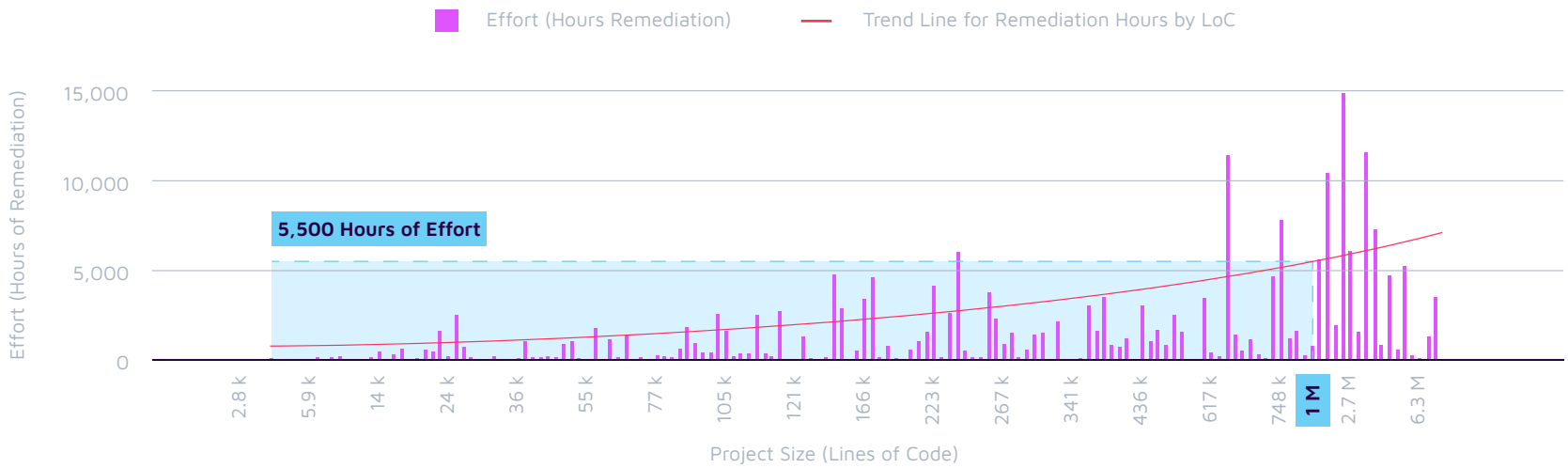
volume of new issues created by the size of repo project

Several factors can impact the volume of new issues created, and we mapped the volume of new issues (and associated remediation time) by the project size based on Lines of Code.

The following plot of "effort" or remediation time versus lines of code shows that the size of the project largely affects the number of new issues created: the larger the project, the more new issues.

REMEDIATION HOURS BY LOC

All Issues



To correlate data across various size projects into relatable insights, we assumed a typical project size of 1M LoC. Based on this assumption, we computed the expected remediation time for all newly created issues over 12 months. The result revealed an estimated 5,500 hours of effort or remediation time required to address all the newly created issues within the 12-month period.

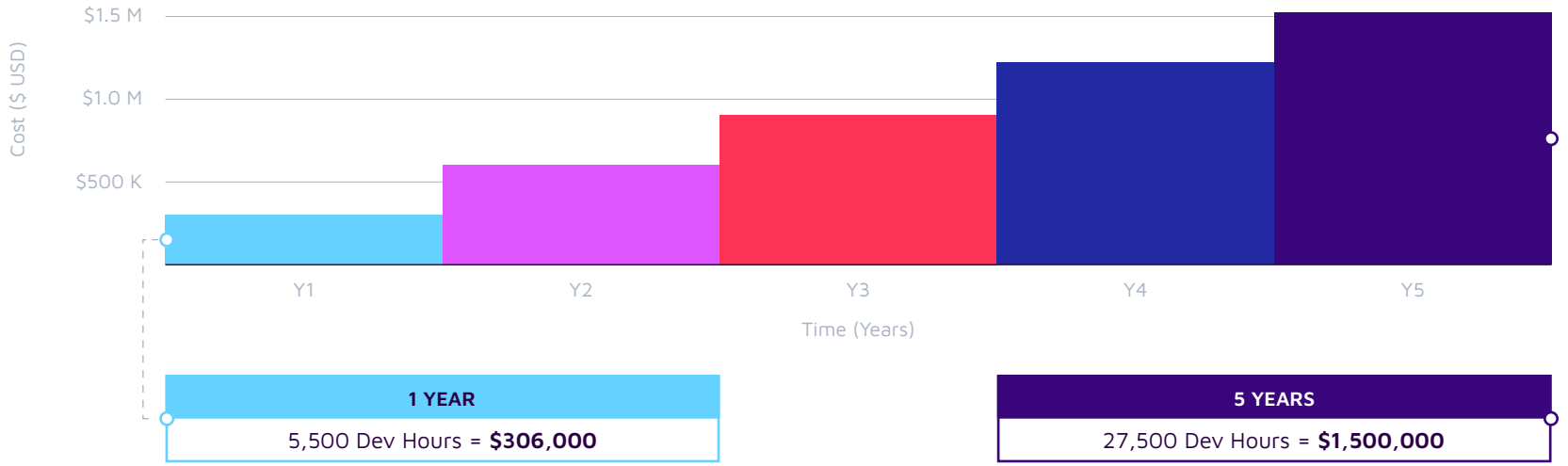
calculating the financial cost

The hours of effort, or developer time, can be converted into an estimated financial cost attributable to the accumulated code-level technical debt.

Assuming the cost of a developer for 1 year (US, fully loaded) at $100,000[4] and the typical 1,800 work hours per year, the cost per hour is $55.56.

5-YEAR CUMULATIVE COST ATTRIBUTABLE TO ALL NEWLY CREATED ISSUES

1M LoC Project



Assuming that issues are created at the same rate the cumulative attributable cost would amount to **$1.5M over 5 years**.

[4] Stackoverflow survey

the actual impact may be far more significant

In this analysis, we estimated the cost associated with fixing newly introduced coding issues. The cost of every unfixed coding issue progressively increases over time. We estimate that issues left for more than 90 days begin to accrue "interest" as the difficulty in remediating them increases.

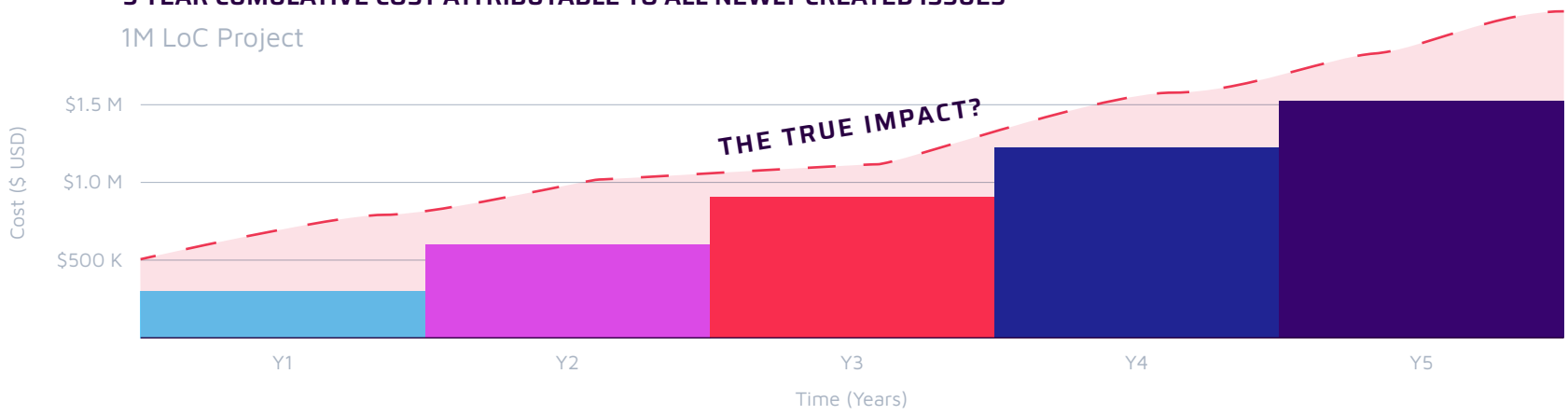
The Clean as You Code methodology identifies and guides developers to fix these issues as they code before they reach production. This proactive approach avoids the increased time and monetary implications that may arise if issues require addressing as part of a future code refactoring effort or are never addressed at all.

Fixing issues as they arise is pragmatic and efficient. Several additional factors contribute to higher after-the-fact remediation costs, or "interest" such as:

+ Issues discovered later in production disrupt business
+ Longer development time to implement new features due to unmaintainable software
+ Loss of business agility because bad code is harder to change
+ Developer churn results in getting to grips with errors created by others

5-YEAR CUMULATIVE COST ATTRIBUTABLE TO ALL NEWLY CREATED ISSUES

1M LoC Project



conclusion

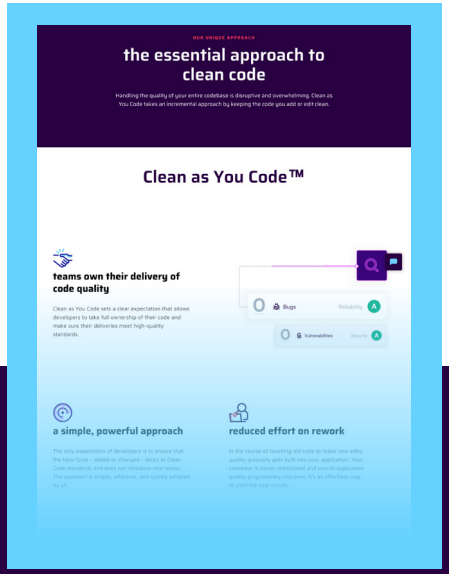
The data extracted from over 200 projects demonstrates that many new issues are created and introduced into code on a regular basis. Unaddressed, these issues accumulate and contribute toward code-level technical debt. The estimated cost attributed to technical debt for a project of 1M LoC was $306K per year or 5,500 developer hours spent on remediation. Over the 5-year lifecycle of an application, these costs could reach $1.5M or the equivalent of 27,500 developer hours.

Given that a developer spends 33% of development time fixing issues in code, the cost to refactor a large portion of an application could be more than 2-3x the cost to fix issues upfront as they occur.

In this study, we focused on attributing the cost of fixing coding issues by examining real-world projects over a defined period and using actual issue remediation times from SonarQube. The actual costs may be far higher when considering the impact issues left unaddressed may have. Debt continues to rise, and addressing issues becomes more complex and burdensome as time passes, impacting the overall software quality. It equates to a significant amount of developer effort and associated costs.

Employing a Clean as You Code methodology allows organizations and their developers to avoid these costs while overcoming the negative long-term impact of technical debt.

resources



Clean as You Code Info Hub

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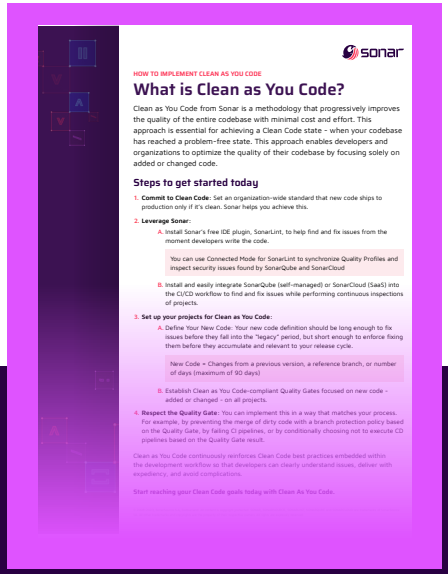
What is Clean as You Code?

LEARN MORE



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