



The Yin and Yang of Software Quality: On the Relationship between Design Patterns and Code Smells

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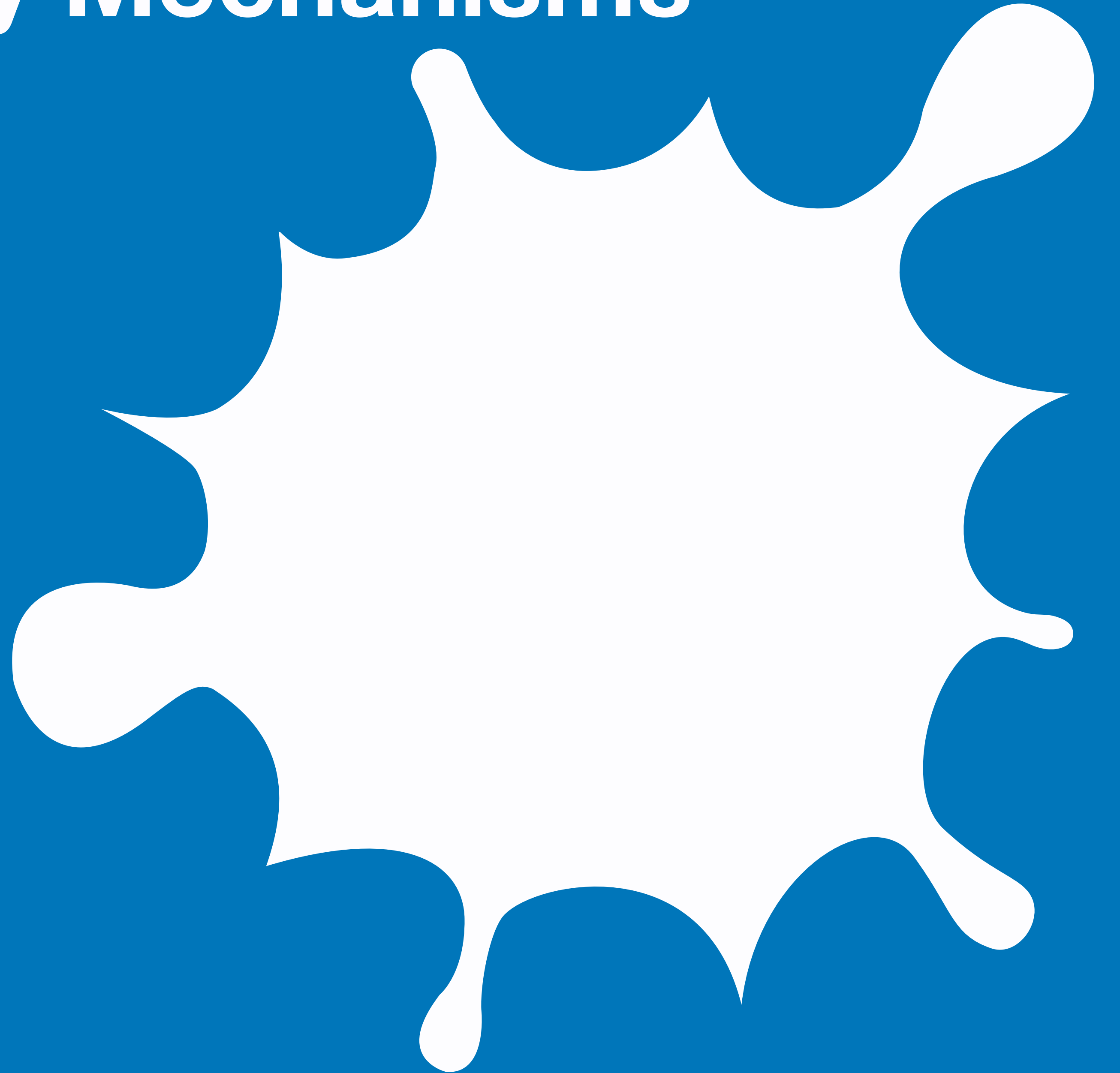
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Reusability Mechanisms



Reusability Mechanisms



Reusability Mechanisms



Cost



Time

Reusability Mechanisms



Cost



Time



Effort

Reusability Mechanisms

Legacy System Wrapping

Third-Party Libraries

Design Patterns

Programming Abstraction

Service Oriented Systems

Program Generator



Reusability Mechanisms

Legacy System Wrapping

Third-Party Libraries

Reusability Mechanisms are essential during Software Evolution and Maintenance!

Service Oriented Systems

Program Generator

Design Patterns

**Reusable solutions for common problems
that arise during the design and
development of software**

Code Smells

A symptom of poor design that can lead to increased effort during maintenance and evolution activities

State of the Art

Myth or Reality? Analyzing the Effect of Design Patterns on Software Maintainability

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Abstract. Although the belief of utilizing design patterns to create better quality software is fairly widespread, there is relatively little research objectively indicating that their usage is indeed beneficial.

In this paper we try to reveal the connection between design patterns and software maintainability. We analyzed more than 300 revisions of JHotDraw, a Java GUI framework whose design relies heavily on some well-known design patterns. We used our probabilistic quality model for estimating the maintainability and we parsed the javadoc annotations of the source code for gathering the pattern instances.

We found that every introduced pattern instance caused an improvement in the different quality attributes. Moreover, the average design pattern line density showed a very high, 0.89 Pearson correlation with the estimated maintainability values. Although the amount of available empirical data is still very small, these first results suggest that the use of design patterns do improve code maintainability.

Keywords: Design patterns, Software maintainability, Empirical validation, OO design

1 Introduction

Since their introduction by Gamma et al. [7], there has been a growing interest in the use of design patterns. Object-Oriented (OO) design patterns represent known solutions to common design problems in a given context. The common belief is that applying design patterns results in a better OO design, and they improve software quality as well [7, 16].

However, there is a little empirical evidence that design patterns really improve code quality. Moreover, some studies suggest that the use of design patterns does not necessarily result in good design [13, 20]. The problem of empirical validation is that it is very hard to assess the effect of design patterns to high-level characteristics e.g.: maintainability, reusability, understandability, etc. Some approaches that manually evaluate the impact of certain design patterns on different quality attributes [11].

We also try to reveal the connection between design patterns and software quality but we focus on the maintainability of the source code. As many concrete maintainability models exist (e.g. [2, 4, 8]) we could choose a model

A Controlled Experiment Comparing the Maintainability of Programs Designed with and without Design Patterns—A Replication in a Programming Environment

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Abstract. Software “design patterns” seek to package proven solutions to design problems that makes it possible to find, adapt and reuse them. To support the industrial use of design patterns, research investigates when, and how, using patterns is beneficial, and whether some patterns are difficult to use than others. This paper describes a replication of an earlier controlled experiment in maintenance, with major extensions. Experimental realism was increased by using a programming environment instead of pen and paper, and paid professionals and consultancy companies as subjects.

Measurements of elapsed time and correctness were analyzed using regression models. The method that took into account the correlations present in the raw data. Together with the subjects’ work, this made possible a better qualitative understanding of the results.

The results indicate quite strongly that some patterns are much easier to understand and use than others. In particular, the Visitor pattern caused much confusion. Conversely, the patterns of a certain extent, Decorator were grasped and used intuitively, even by subjects with no experience of patterns.

The implication is that design patterns are not universally good or bad, but must be used when they match the problem and the people. When approaching a program with documented design patterns, even basic training can improve both the speed and quality of maintenance activities.

Keywords: Controlled experiment, design patterns, real programming environment

Do Design Patterns Impact Software Quality Positively?

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Abstract

We study the impact of design patterns on quality attributes in the context of software maintenance and evolution. We show that, contrary to popular beliefs, design patterns in practice impact negatively several quality attributes, thus providing concrete evidence against common lore. We then study design patterns and object-oriented best practices by formulating a second hypothesis on the impact of these principles on quality. We show that results for some design patterns cannot be explained and conclude on the need for further studies. Thus, we bring further evidence that design patterns should be used with caution during development because they may actually impede maintenance and evolution.

1. Introduction

Many studies in the literature (including some by these authors) have for premise that design patterns [2] improve the quality of object-oriented software systems, because design patterns are supposed to improve the quality of systems, for example [2, page xiii] or [10].

Yet, some studies, e.g., [11], suggest that the use of design patterns do not always result in “good” designs. For example, a tangled implementation of patterns impacts negatively quality [8]. Also, patterns generally ease future enhancement at the expense of simplicity.

There is little empirical evidence to support the claims of improved reusability¹, expandability and understandability as put forward in [2] when applying design patterns.

Therefore, we carry an empirical study of the impact of design patterns on the quality of systems as perceived by software engineers in the context of maintenance and evolution. Our hypothesis verifies software

¹Although reusability in [2] may refer to the reusability of the solutions of the design patterns, we consider reusability as the reusability of the piece of code in which a pattern is implemented.

engineering lore: design patterns impact software quality positively. Our objective is to provide evidence to confirm or refute the hypothesis. We perform this by asking respondents their evaluations of the impact of design patterns on quality after their use.

We present detailed results for three design patterns: Abstract Factory, Composite, Flyweight. We study three quality attributes: reusability, understandability, and expandability. Results for other patterns and quality attributes can be found in [5]. We show that, contrary to popular beliefs, patterns in practice do not always improve quality attributes, thus providing evidence against common lore. We attempt to explain these results using object-oriented best practices. We conclude on the need for further studies and terms should be used with caution because they may actually impede maintenance and evolution.

Section 2 presents related work and their contributions. Section 3 states the hypothesis and the design of the study and presents our data collection and analysis. Section 4 describes our quantification of quality and presents the results of our survey. Section 5 contains a discussion of the results. Section 6 contains our research, discusses the threats to the validity of the study and introduces future work.

2. Related Work

Since their introduction by Gamma et al. [7], there has been a growing interest on the use of design patterns. We present here some lines of work on the impact of patterns on quality.

Lange and Nakamura demonstrated [6] that design patterns can serve as guide in program exploration and thus make the process of program understanding more efficient. However this study was limited to the impact of a single design pattern on a single quality attribute and to a little number of patterns.

Wydaeghe et al. [12] presented a study on the concrete use of six design patterns. They discuss the impact of these patterns on reusability, mo-

An exploratory study of the impact of antipatterns on class change- and fault-proneness

Foutse Khomh · Massimiliano Di Penta · Yann-Gaël Guéhéneuc · Giuliano Antoniol

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Editor: Jim Whitehead

Abstract Antipatterns are poor design choices that are conjectured to make object-oriented systems harder to maintain. We investigate the impact of antipatterns on classes in object-oriented systems by studying the relation between the presence of antipatterns and the change- and fault-proneness of the classes. We detect 13 antipatterns in 54 releases of ArgoUML, Eclipse, Mylyn, and Rhino, and analyse (1) to what extent classes participating in antipatterns have higher odds to change or to be subject to fault-fixing than other classes, (2) to what extent these odds (if higher) are due to the sizes of the classes or to the presence of antipatterns, and (3) what kinds of changes affect classes participating in antipatterns. We show that, in almost all releases of the four systems, classes participating in antipatterns are more change- and fault-prone than others. We also show that size alone cannot explain the higher odds of classes with antipatterns to undergo a (fault-fixing) change than other

We thank Marc Eaddy for making his data on faults freely available. This work has been partly funded by the NSERC Research Chairs in Software Change and Evolution and in Software Patterns and Patterns of Software.

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Abstract

engineering, lower, design, patterns, impact, software

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Since their introduction by Gamma et al. [7], there has been a growing interest in the use of design patterns. Object-Oriented (OO) design patterns represent known solutions to common design problems in a given context. The general belief is that applying design patterns results in a better OO design, and they improve software quality as well [7, 16].

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State of the Art

The relationship between design patterns and code smells: An exploratory study



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ABSTRACT

Context—Design patterns represent recommended generic solutions to various design problems, whereas code smells are symptoms of design issues that could hinder further maintenance of a software system. We can intuitively expect that both concepts are mutually exclusive, and the presence of patterns is correlated with the absence of code smells. However, the existing experimental evidence supporting this claim is still insufficient, and studies separately analyzing the impact of smells and patterns on code quality deliver diverse results.

Objective—The aim of the paper is threefold: (1) to determine if and how the presence of the design patterns is linked to the presence of code smells, (2) to investigate if and how these relationships change throughout evolution of code, and (3) to identify the relationships between individual patterns and code smells.

Method—We analyze nine design patterns and seven code smells in two medium-size, long-evolving, open source Java systems. In particular, we explore how the presence of design patterns impacts the presence of code smells, analyze if this link evolves over time, and extract association rules that describe their individual relationships.

Results—Classes participating in design patterns appear to display code smells less frequently than other classes. The observed effect is stronger for some patterns (e.g., Singleton, State-Strategy) and weaker for others (e.g., Composite). The ratio between the relative number of smells in the classes participating in patterns and the relative number of smells in other classes, is approximately stable or slightly decreasing in time.

Conclusion—This observation could be used to anticipate the smell-proneness of individual classes, and improve code smell detectors. Overall, our findings indicate that the presence of design patterns is linked with a lower number of code smell instances. This could support programmers in a context-sensitive analysis of smells in code.

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1. Introduction

Design patterns and code smells represent two different approaches to assuring source code quality. The first approach, perfective, is focused on solutions which positively impact some attributes of quality, and which have been empirically validated. The other approach, preventive, concentrates on detecting and

removing elements that could be harmful for a software system, or make it insufficiently effective. Moreover, the preventive methods also include mechanisms that can identify symptoms of anomalies before their negative impact on quality grows and could become destructive for the system.

Design patterns represent the perfective group as they describe practically validated solutions to recurring design problems. They can easily be adapted and applied several times without changing the core of the concept. Since their introduction to software engineering by the Gang of Four in 1994 [15], they have been an object of rising interest of programmers and researchers, and practically demonstrated their ability to be implemented in different contexts. Intuitively, it is expected that the use of design patterns

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State of the Art

Patterns and code smells: An



Patterns represent recommended generic solutions to various design problems, whereas code smells represent symptoms of design issues that could hinder further maintenance of a software system. We expect that both concepts are mutually exclusive, and the presence of patterns is negatively correlated with the presence of code smells. However, the existing experimental evidence supporting this hypothesis is limited, and studies separately analyzing the impact of smells and patterns on code quality are scarce.

The goal of the paper is threefold: (1) to determine if and how the presence of design patterns impacts the presence of code smells, (2) to investigate if and how these relationships change over time, and (3) to identify the relationships between individual patterns and code smells.

We analyze nine design patterns and seven code smells in two medium-size, long-evolving, real-world projects. In particular, we explore how the presence of design patterns impacts the presence of code smells, analyze if this link evolves over time, and extract association rules that describe the relationships between patterns and smells.

Our results show that classes participating in design patterns appear to display code smells less frequently than other classes. This effect is stronger for some patterns (e.g., Singleton, State-Strategy) and weaker for others (e.g., Builder). The ratio between the relative number of smells in the classes participating in design patterns and the relative number of smells in other classes, is approximately stable or slightly decreasing over time.

Our findings could be used to anticipate the smell-proneness of individual classes, and to guide developers and code inspectors. Overall, our findings indicate that the presence of design patterns is linked to a lower number of code smell instances. This could support programmers in a context-sensitive way when reviewing code.

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Two medium projects have been analyzed from an evolutionary standpoint

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The authors consider 7 kinds of code smells principally related to Coupling

State of the Art

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The ratio between the relative number of Smells in classes participating in Design Patterns and the relative number of Smells in other classes is approximately the same

Limitations



Limitations

The paper considers **only two medium** size projects



Limitations

The paper considers **only two medium** size projects

No investigation on the relationship between **Design Patterns** and **Code Smells** that **impact Understandability** and **Code**



Why is it important?

Design Patterns are commonly used facilitate the **Maintenance** of source code

For this reason, it is **essential** to understand the possible **relationship** with specific **Code Smells** that can impact the **Understandability** and **Code Comprehension**

Goal

Investigating whether and how **Design Patterns instances** are related to the emergence of **Code Smells instances** that impact **Understandability** and **Code Comprehension**

How do we assessed our goal?

We conducted a **large empirical investigation** by considering **over 540 releases of 15 projects**, on the relationship between **Design Patterns and Code Smells**

Research Questions



Research Questions



What are the **co-occurrences** in terms of classes between **Design Patterns** and **Code Smells**?



Research Questions



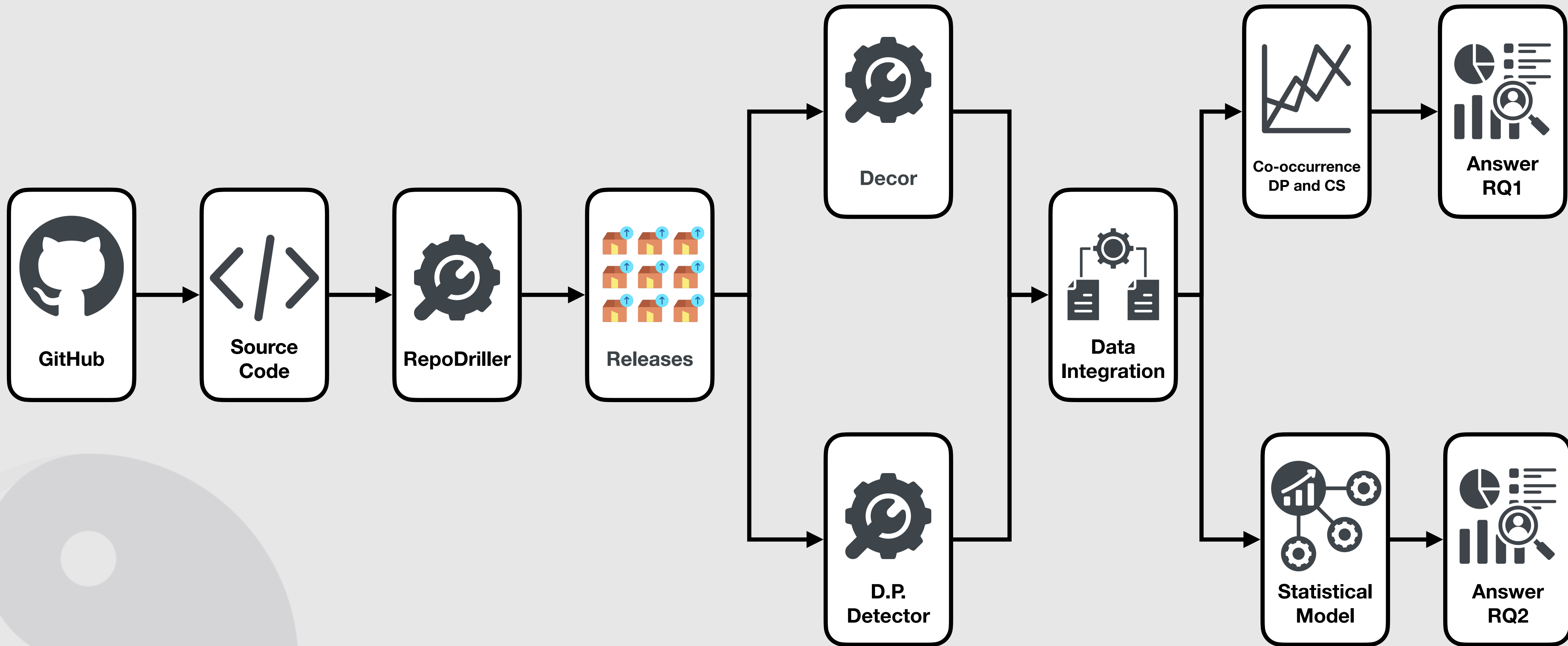
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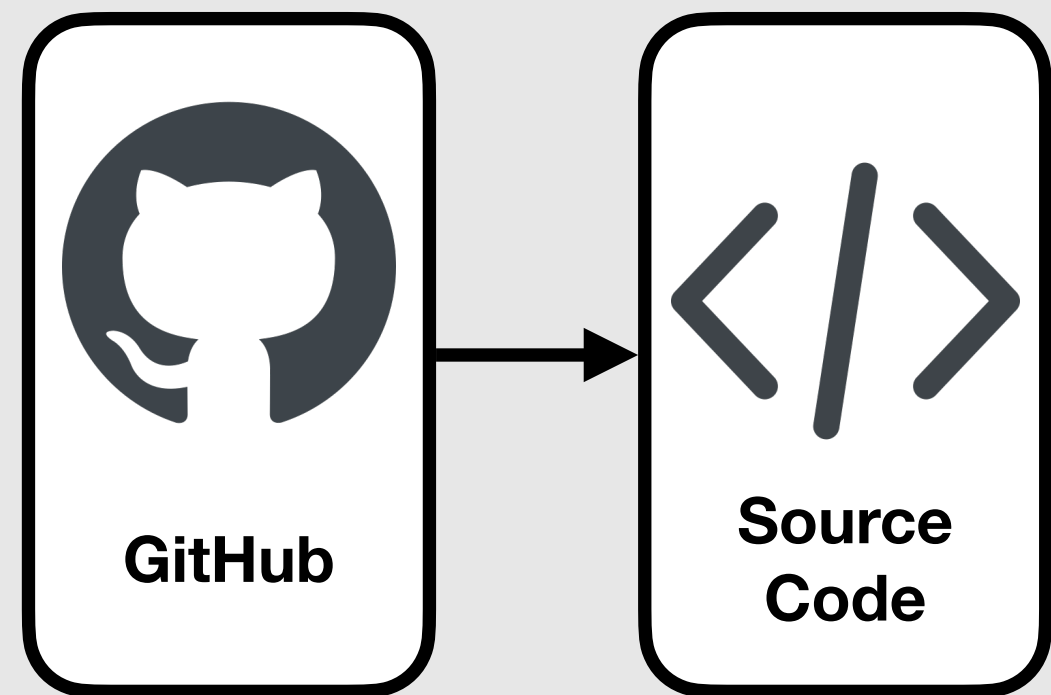
To what extent does the presence of **Design Patterns** affect **Code Smells**?



Research Process

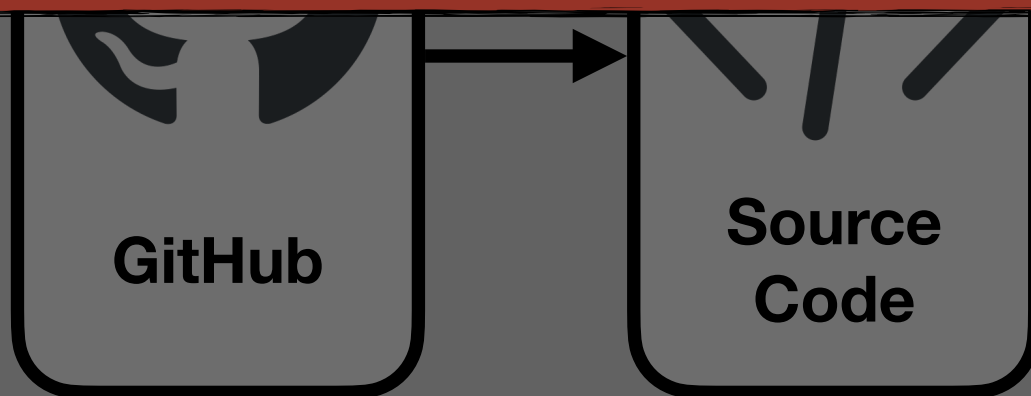


Research Process



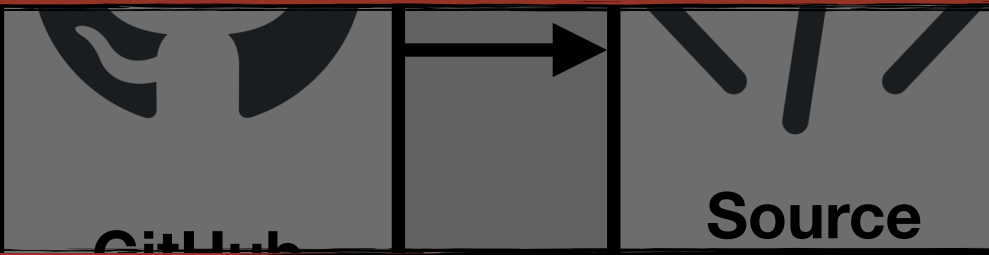
Research Process

We mined **15** popular **Java** projects



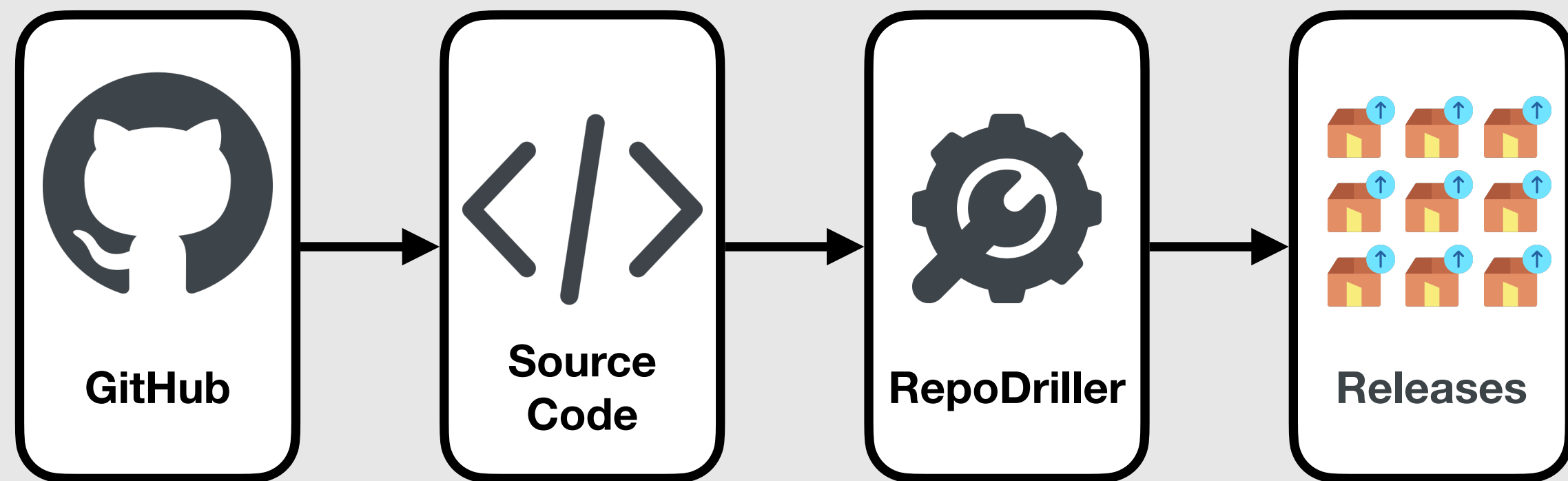
Research Process

We mined **15** popular **Java** projects



We **selected** projects with **at least one Design Pattern** and based on the **popularity** in terms of **number of stars**

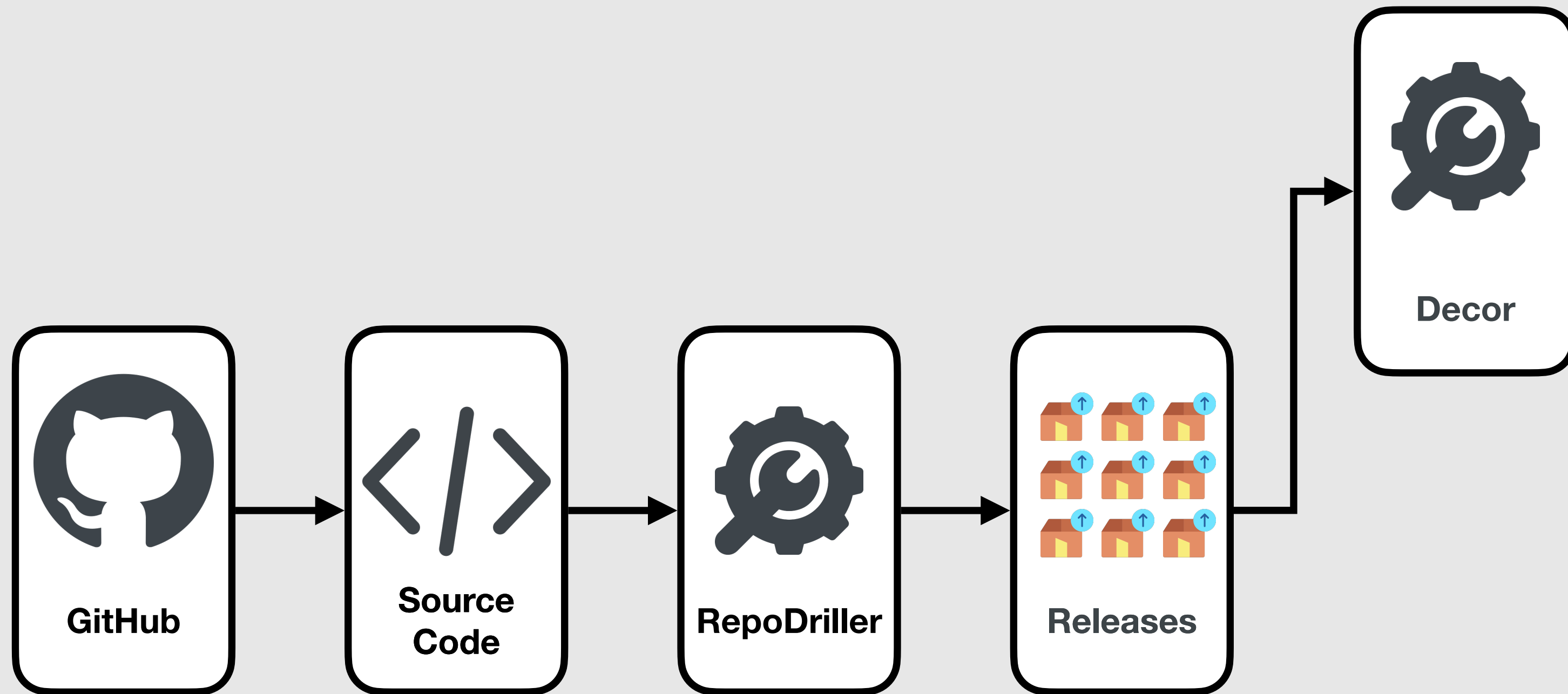
Research Process



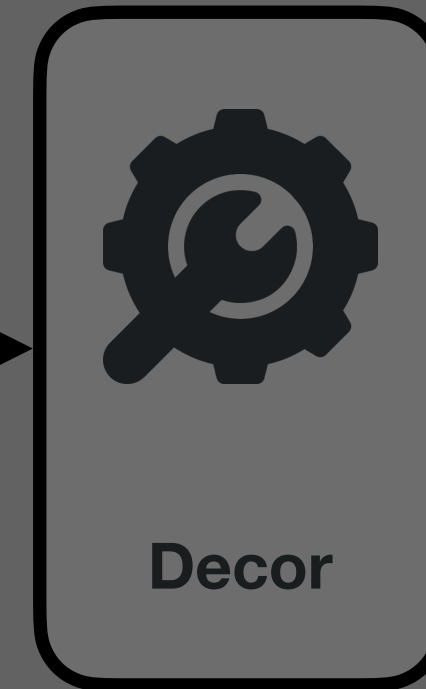
Research Process

We used as experimental objects over 540 releases

Research Process

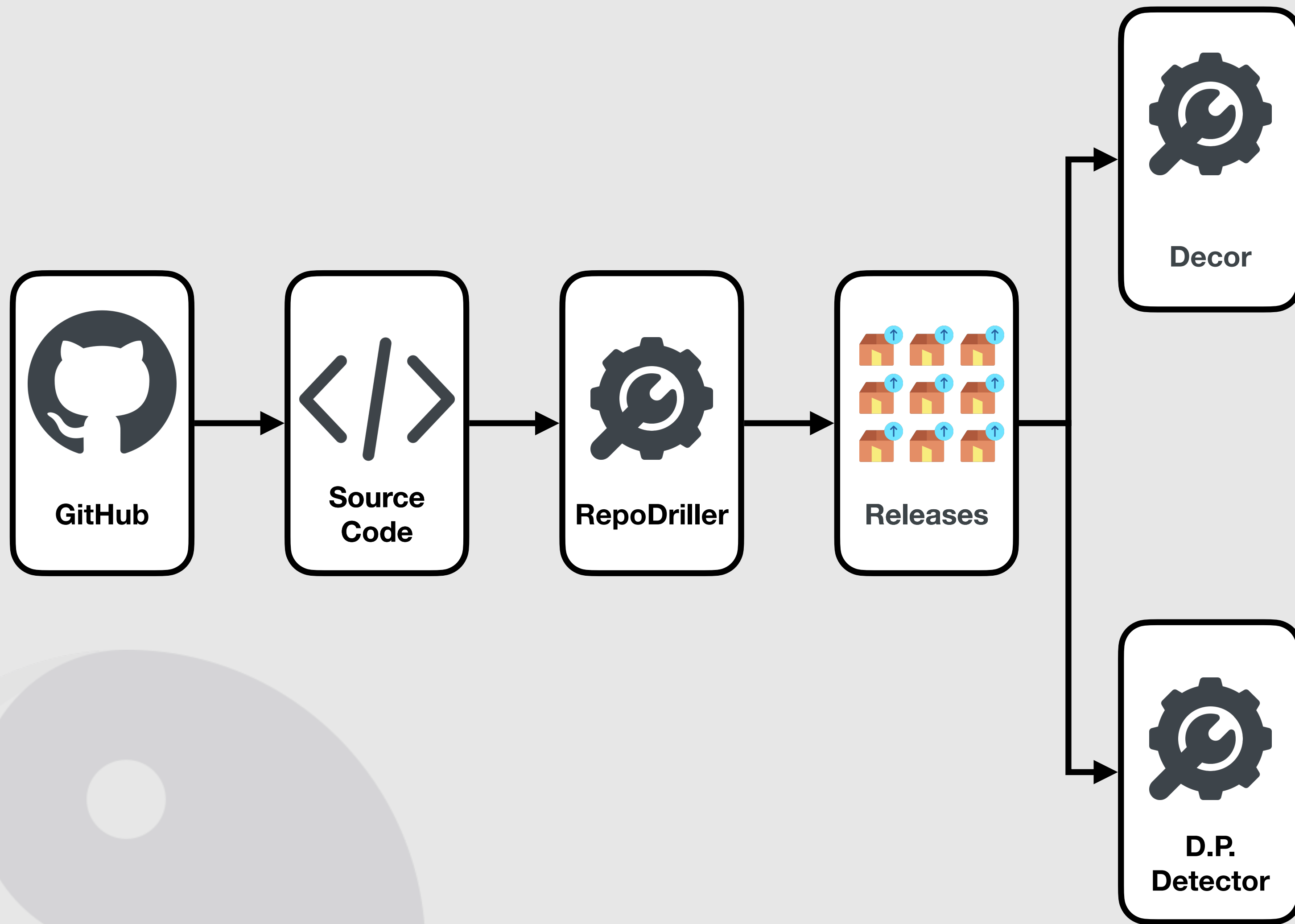


Research Process



We set up Decor to extract Smells that impact **Understandability** and **Code Comprehension** i.e., **Complex Class**, **God Class**, and **Spaghetti Code**

Research Process



Research Process



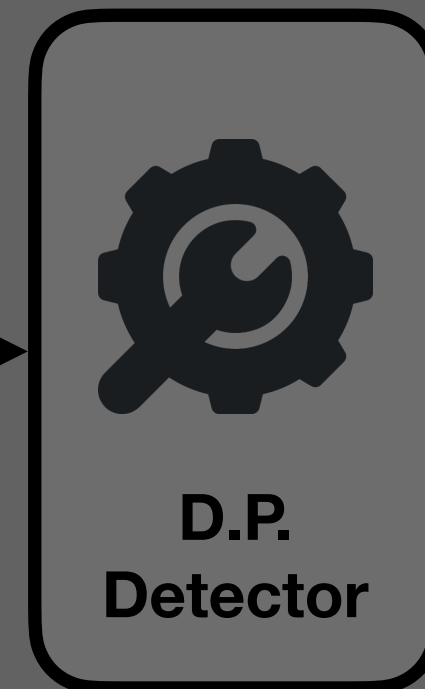
We considered **all** the **Design Patterns detectable** with the tool of **Tsantalis et al.**

GitHub

Source
Code

RepoDriller

Releases



D.P.
Detector

Research Process



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RepoDriller

Releases

Due to the constraints of the tool, we selected only projects buildable without errors



List of Design Patterns

Adapter/Command

Bridge

Singleton

Template Method

Proxy

State/Strategy

Decorator

Factory Method

Component

Observer

List of Design Patterns

Adapter/Command

State/Strategy

Due to the identical UML, the tool is not able to detect differences between “Adapter” and “Command” and “State” and “Strategy”

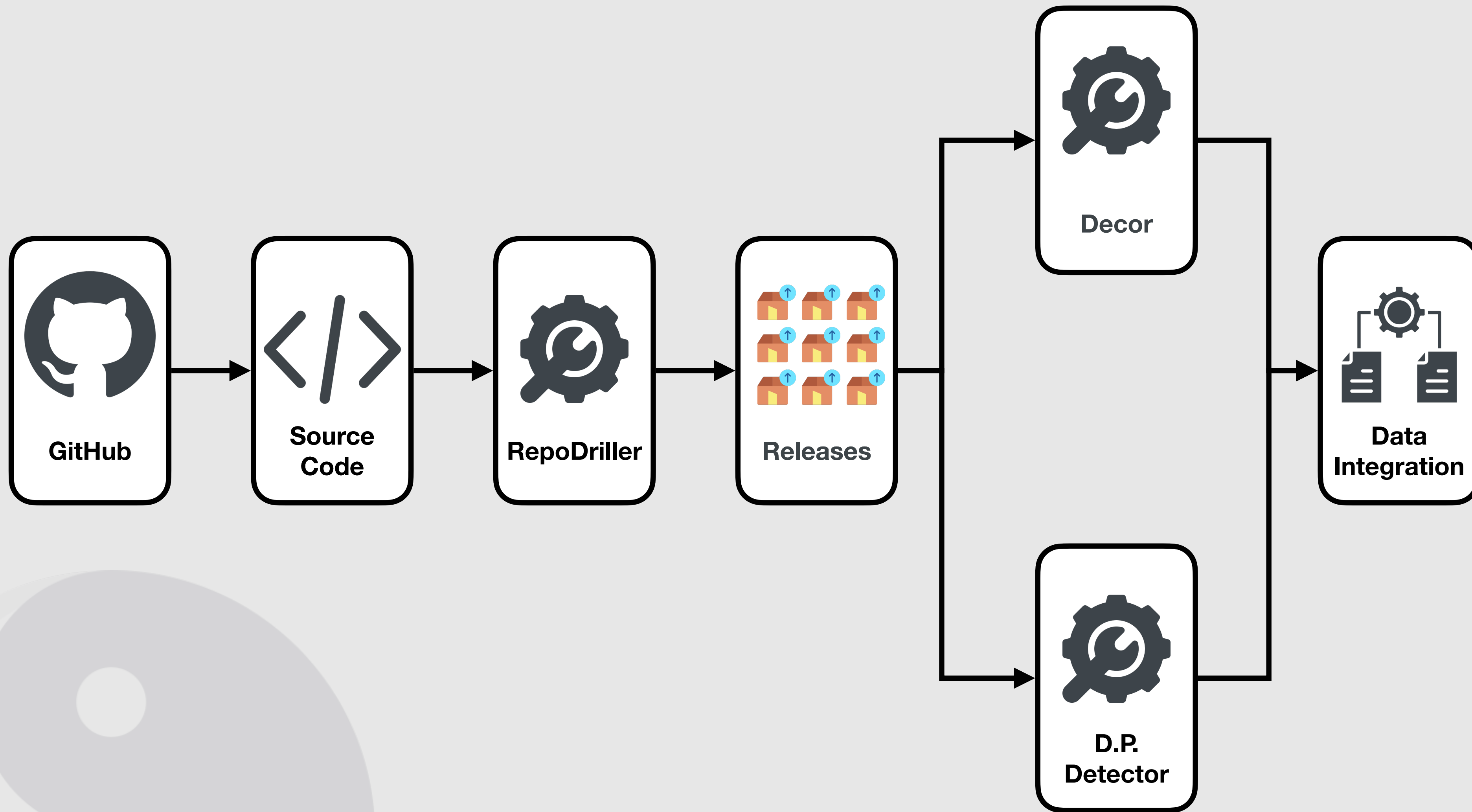
Template Method

Component

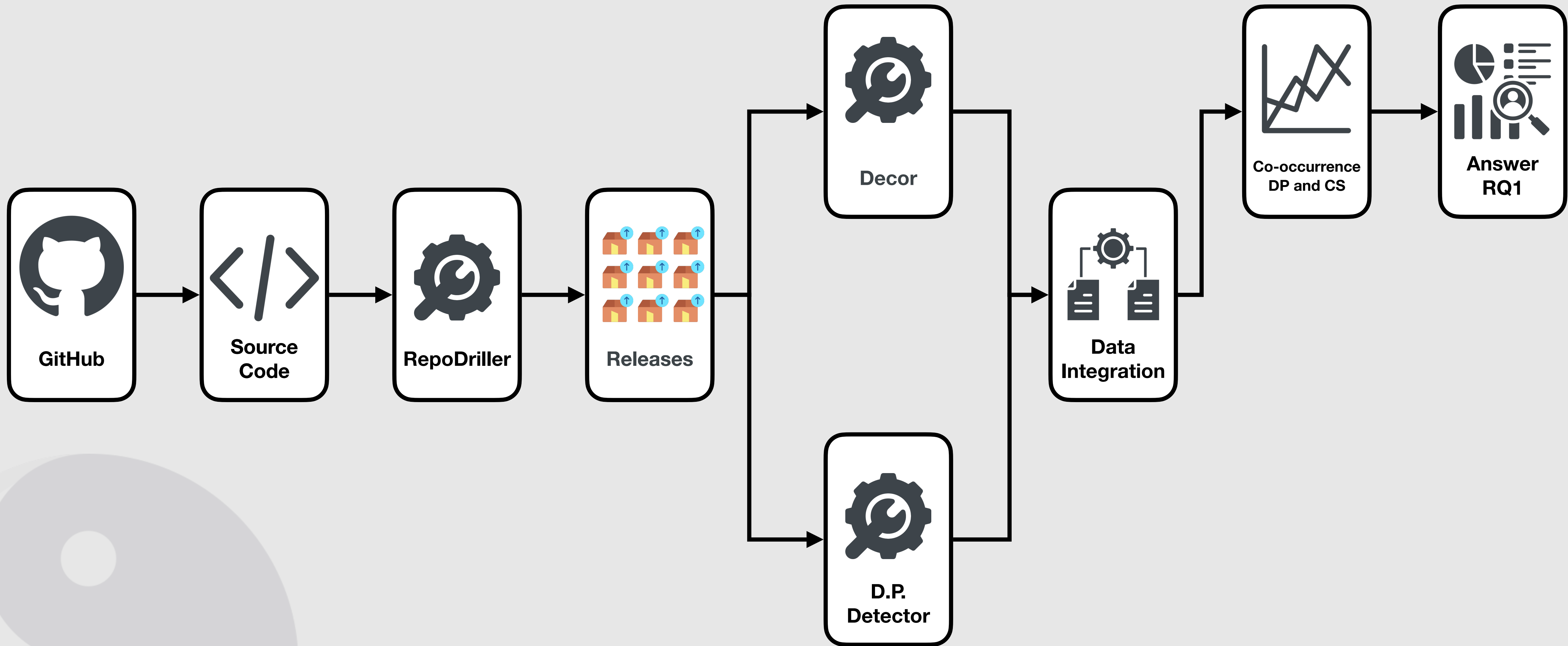
Proxy

Observer

Research Process

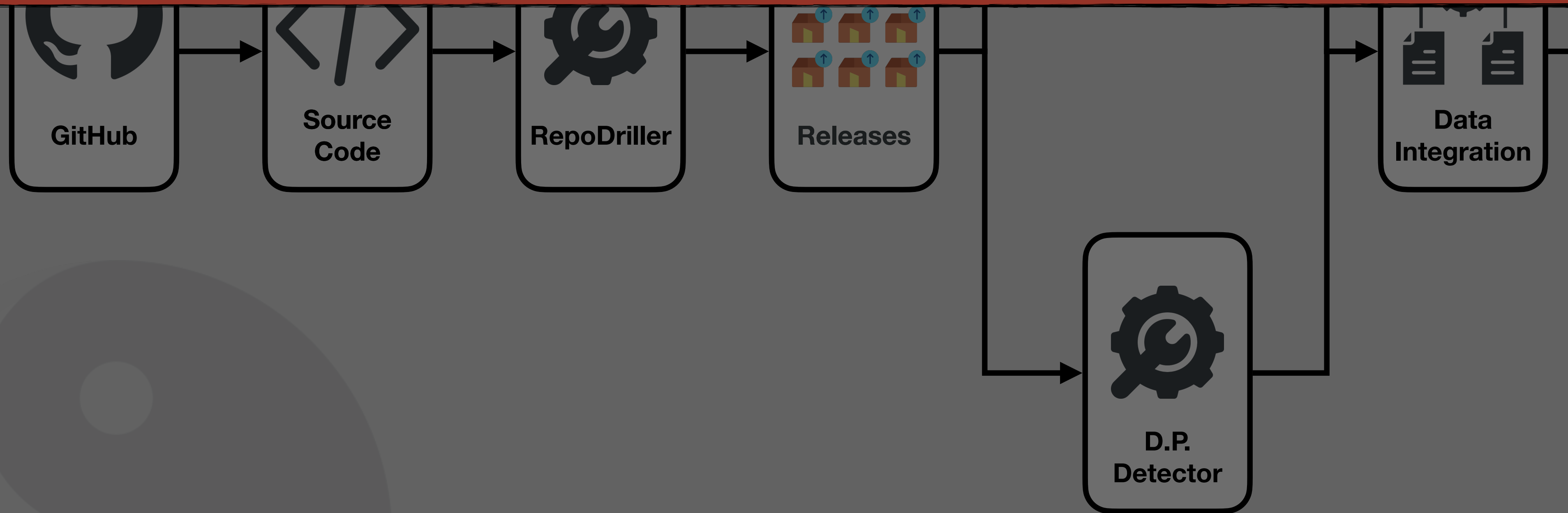


Research Process



Research Process

We calculate the frequency of classes that participate to **Design Patterns** and **simultaneity** are affected by **Code Smells**



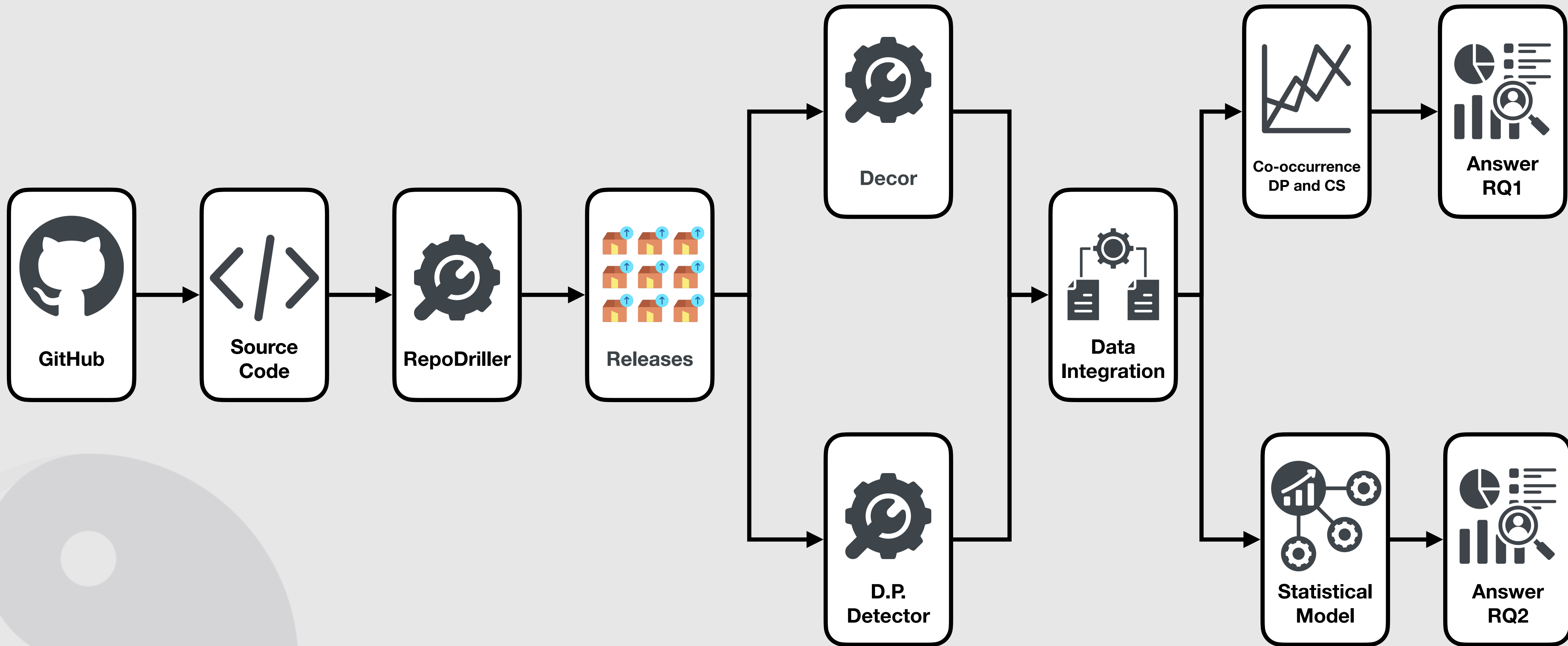
Research Process

We calculate the **frequency** of classes that **participate** to **Design Patterns** and **simultaneity** are affected by **Code Smells**

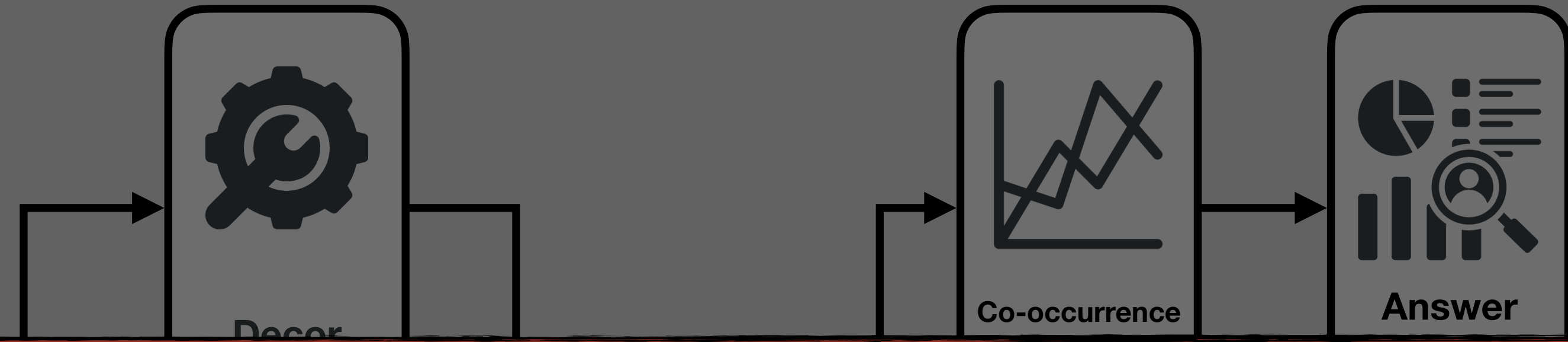


We **normalize** the data using **MIN-MAX** and then **plot the results**

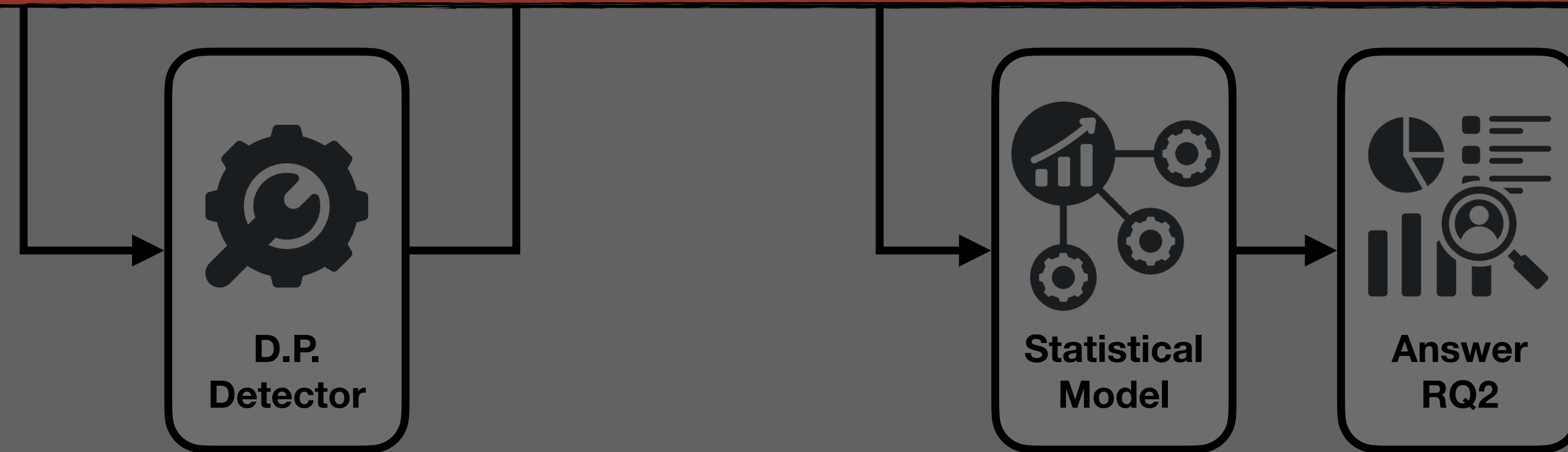
Research Process



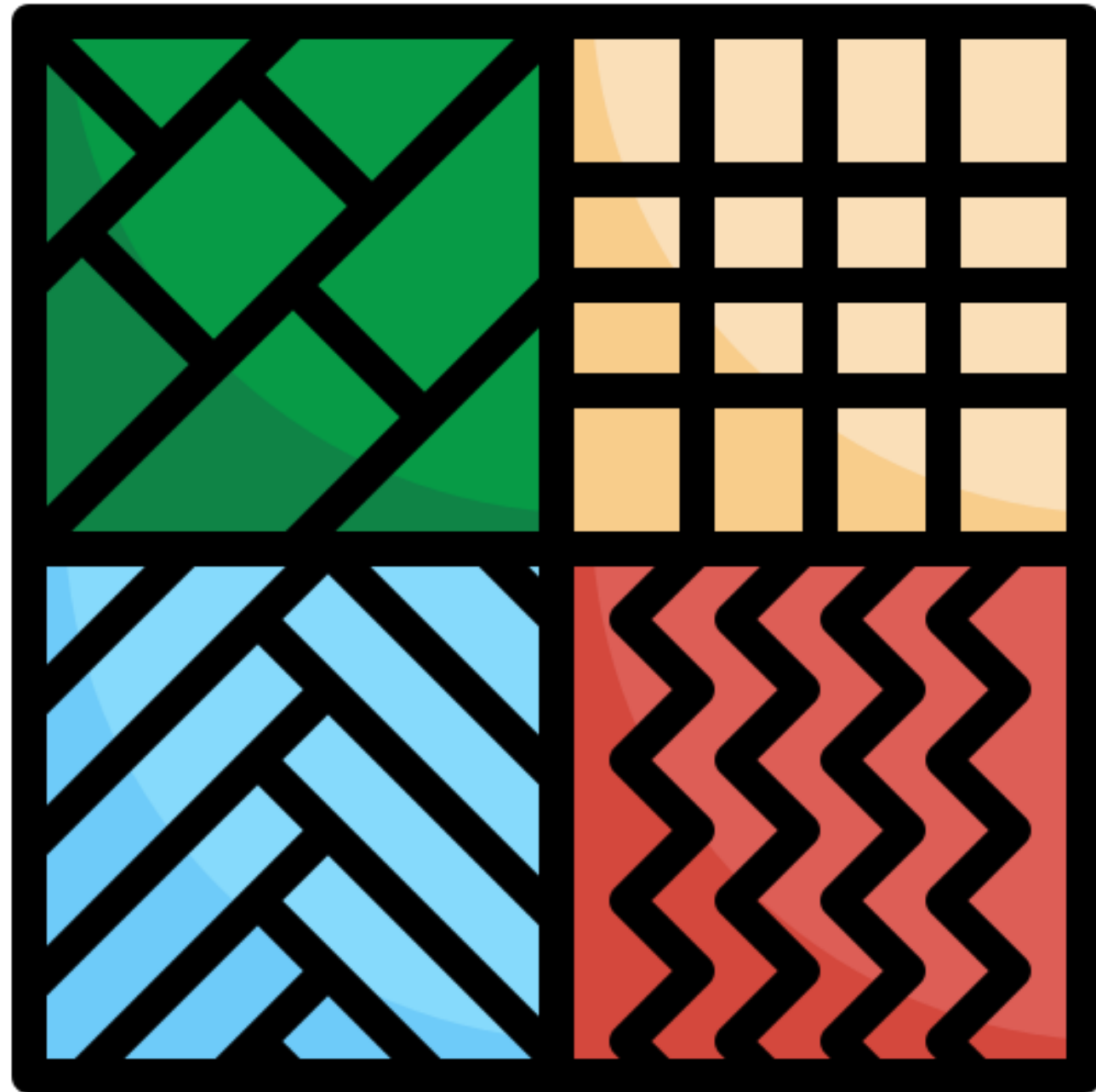
Research Process



To assess the results of the RQ2, we use the **Generalized Linear Model**



Variables of our model



**Independent
Variable**

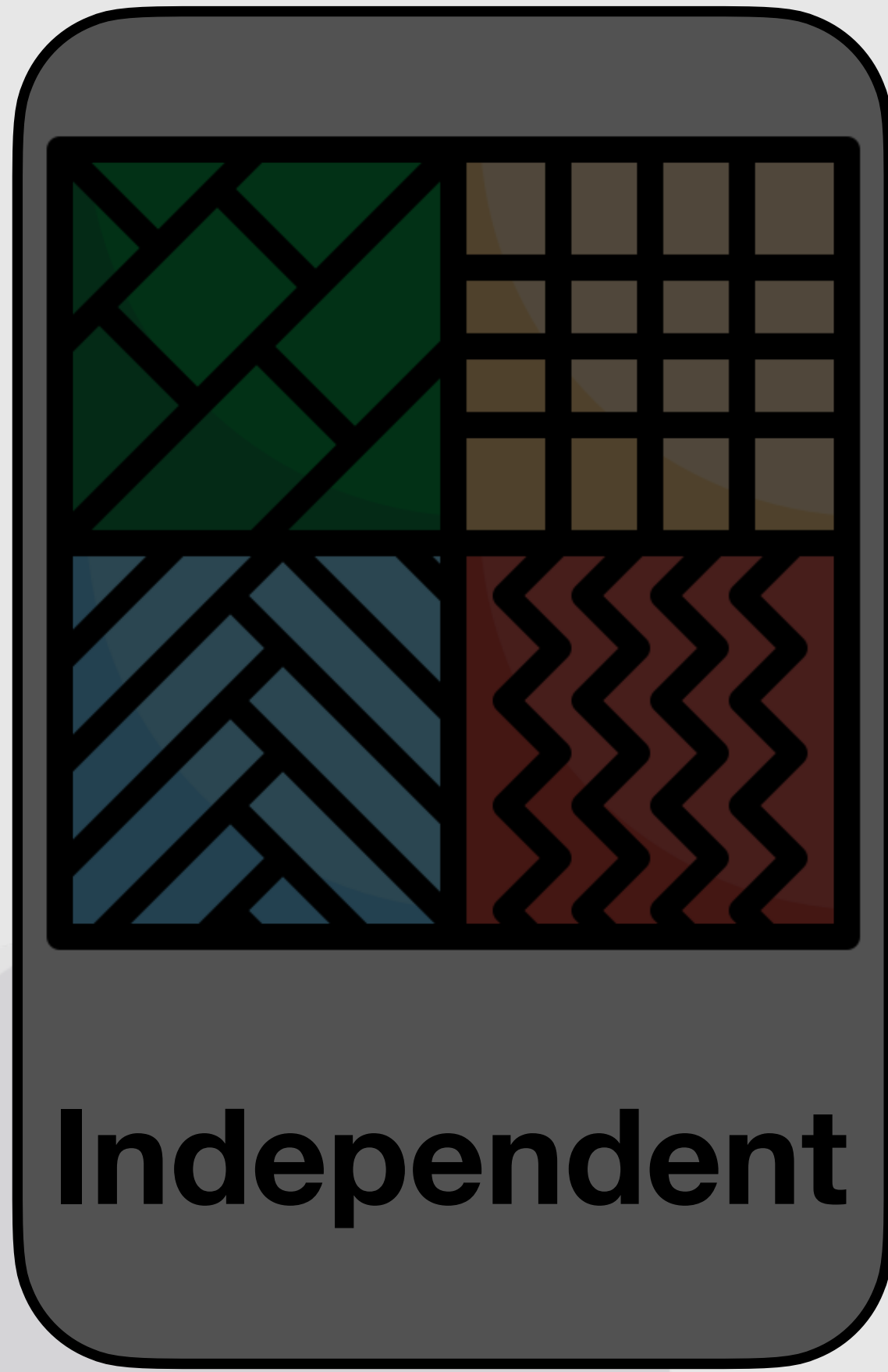


Dependent

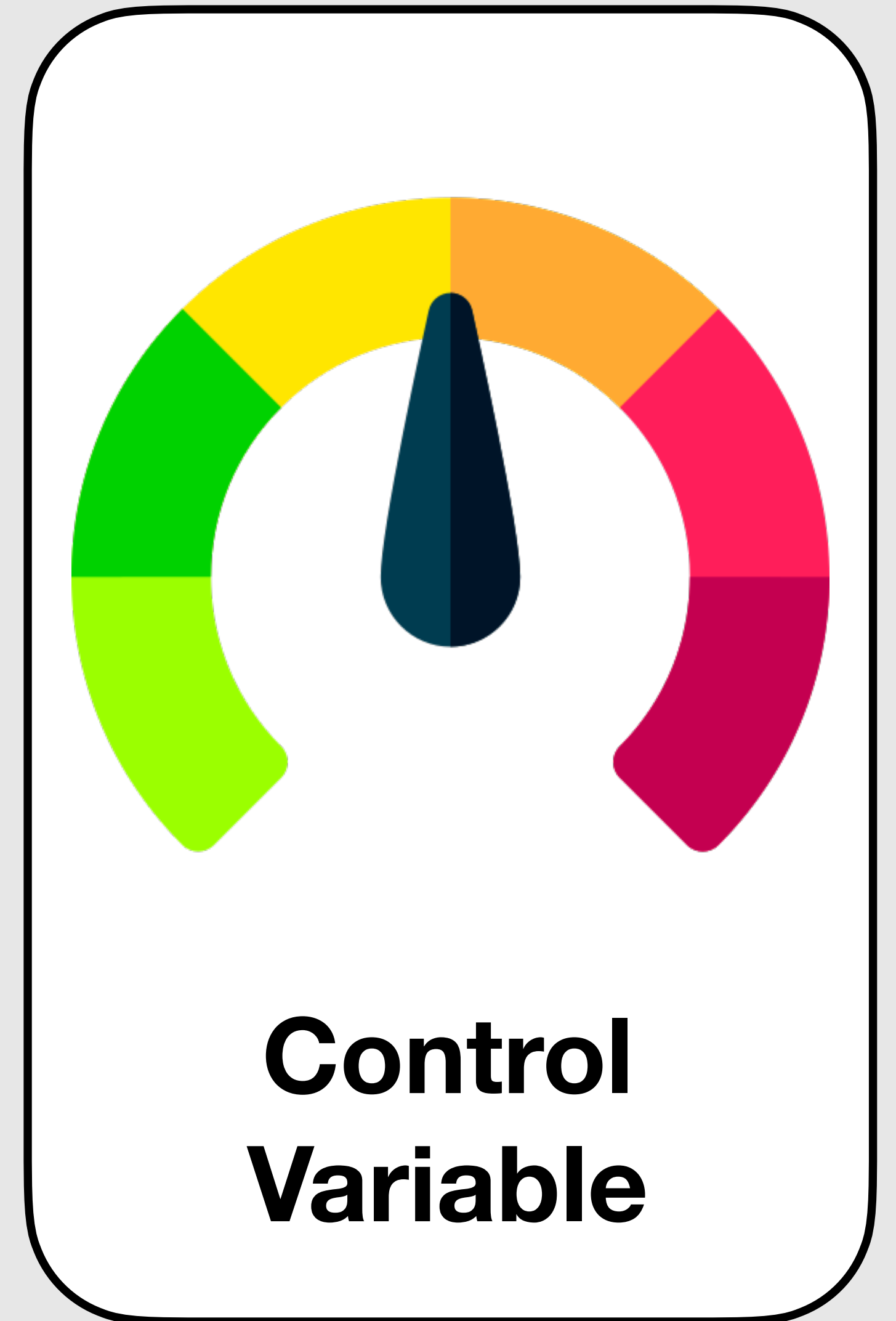
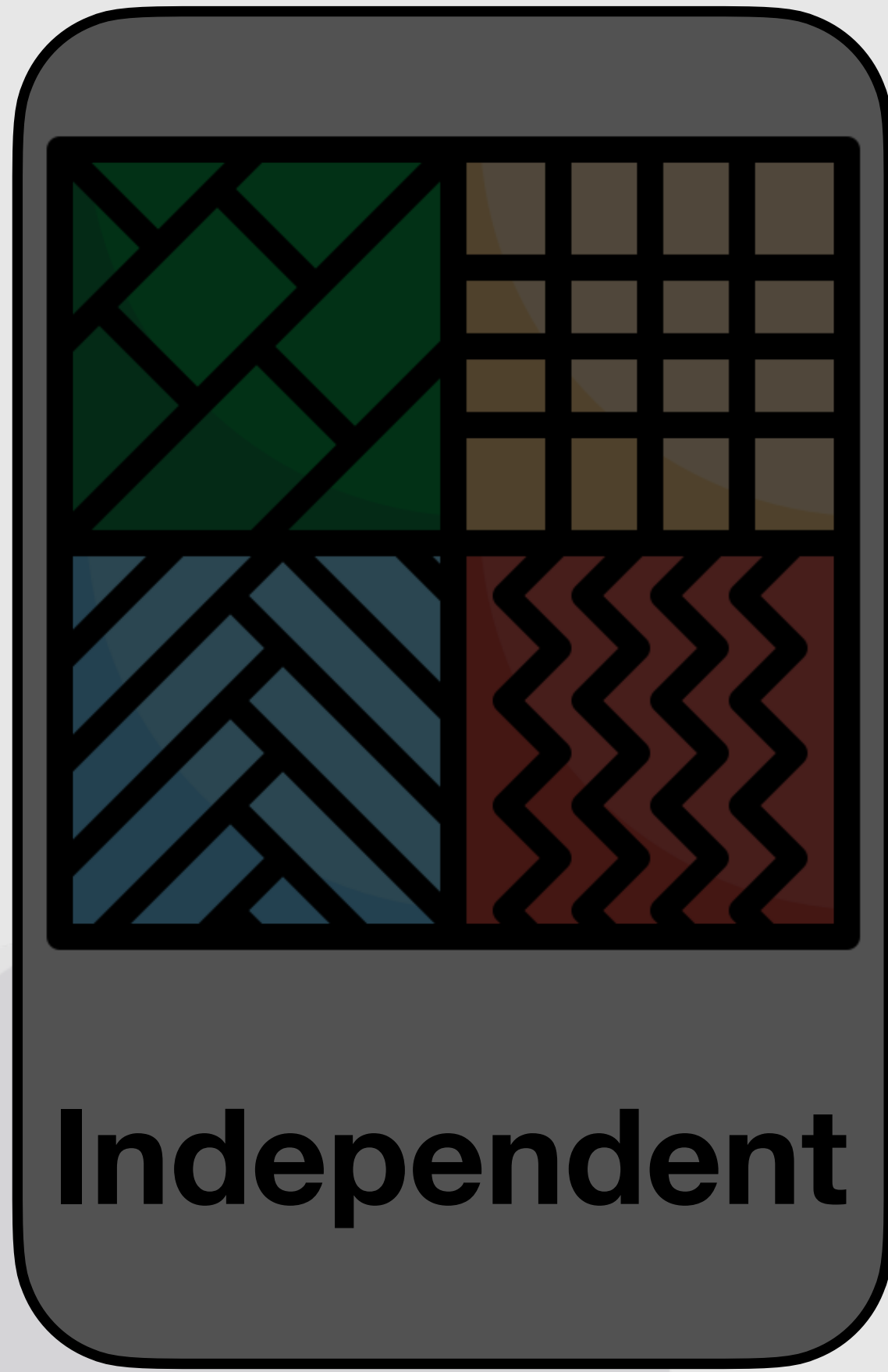


Control

Variables of our model



Variables of our model



Variables of our model

A **positive** coefficient indicates a **positive** correlation between the **independent variables** and the **dependent variable**

A **negative** coefficient indicates a **negative** correlation between the **independent variables** and the **dependent variable**

Co-occurrences of Design Patterns and Code Smells

46%

projects contain **no instances** of classes that participate
in **Design Patterns** and **simultaneously**
are affected by **Code Smells**

46%

projects contain
no instances of classes that
participate in **Design Patterns**
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54%

projects contain **instances**
of classes that participate in
Design Patterns
and **simultaneously**
are affected by **Code Smells**

Co-occurrence of Design Patterns and Code Smells

In all projects where exists a **co-occurrence** between **Design Patterns** and **Code Smells**, the classes implementing **State/Strategy** are affected by **God Class**



In 8 projects the Design Pattern **State/Strategy** was also affected by **Spaghetti Code**, while in other 4 projects **Complex Class** was identified

Co-occurrence of Design Patterns and Code Smells

In all projects where exists a **co-occurrence** between **Design Patterns**



Results might be due to **State/Strategy** implementing **several responsibilities**

In 8 projects the Design Pattern **State/Strategy** was also affected by **Spaghetti Code**, while in other 4 projects **Complex Class** was identified

On the presence of Design Patterns and how they affect Code Smells

60%

of projects are characterized by a **statistical correlation** between **Design Patterns** and **Code Smells**

On the presence of Design Patterns and how they affect Code Smells



On Design Patterns and how they affect Code Smells

	God Class			
Adapter/Command	+	+	+	
Bridge	+	+	+	
Component	+	+	+	
Singleton	+	+	+	
Factory Method				
Template Method				
State/Strategy				
Observer				
Proxy				
Decorator				


+ Low Positive Statistical Correlation
++ Medium Positive Statistical Correlation
+++ Strong Positive Statistical Correlation
- Low Negative Statistical Correlation
-- Medium Negative Statistical Correlation
--- Strong Negative Statistical Correlation

On Design Patterns and how they affect Code Smells

	God Class			Spaghetti Code		
Adapter/Command	+	+	+	-		
Bridge	+	+	+			
Component	+	+	+			
Singleton	+	+	+	-	-	
Factory Method				+	+	+
Template Method				+	+	+
State/Strategy				+	+	+
Observer						
Proxy						
Decorator						

- + **Low Positive** Statistical Correlation
- ++ **Medium Positive** Statistical Correlation
- +++ **Strong Positive** Statistical Correlation
- **Low Negative** Statistical Correlation
- **Medium Negative** Statistical Correlation
- **Strong Negative** Statistical Correlation

On Design Patterns and how they affect Code Smells

	God Class	Spaghetti Code	Complex Class
Adapter/Command	+++	-	
Bridge	+++		
Component	+++		
Singleton	+++	- -	
Factory Method		+++	
Template Method		+++	
State/Strategy		+++	
Observer			
Proxy			
Decorator			

+ Low Positive Statistical Correlation
++ Medium Positive Statistical Correlation
+++ Strong Positive Statistical Correlation
- Low Negative Statistical Correlation
- - Medium Negative Statistical Correlation
- - - Strong Negative Statistical Correlation

On Design Patterns and how they affect Code Smells

	God Class	Spaghetti Code	Complex Class
Adapter/Command	+++	-	✗
Bridge	+++		
Although the findings of the RQ1 show the co-occurrences between several Design Patterns and the Complex Class, the results indicate that there is no correlation			
Template Method		+++	
State/Strategy		+++	
Observer			
Proxy			
Decorator			

+ Low Positive Statistical Correlation
++ Medium Positive Statistical Correlation
+++ Strong Positive Statistical Correlation
- Low Negative Statistical Correlation
-- Medium Negative Statistical Correlation
--- Strong Negative Statistical Correlation

The presence of **Design Patterns** does not necessarily guarantee a high quality, as they might be correlated with **Code Smells**

An abuse or misuse of Design Patterns can lead to an increase the Code Complexity and a decrease of Code Comprehension

An **abuse or misuse**
of **Design Patterns**
can lead to an
increase the Code
Complexity and a
decrease of Code
Comprehension

The introduction of
Design Patterns
should be carefully
planned at design
time, to resolve
specific problems, to
avoid making
sub-optimal choices

Summing up

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We analyzed over 540 releases of
15 Java projects

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Classes participating in Design Patterns are
often affected by Code Smells themselves

Summing up

We analyzed over 540 releases of
15 Java projects

Classes participating in Design Patterns are
often affected by Code Smells themselves

Out of 10 Design Patterns analyzed, 7 showed
a positive correlation with the presence of at
least one Code Smell

Future Work

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Future Work

Extend the dataset

Future Work

Extend the dataset

Understand the developers' perspective on the impact of Design Pattern on Code Smells

Future Work

Extend the dataset

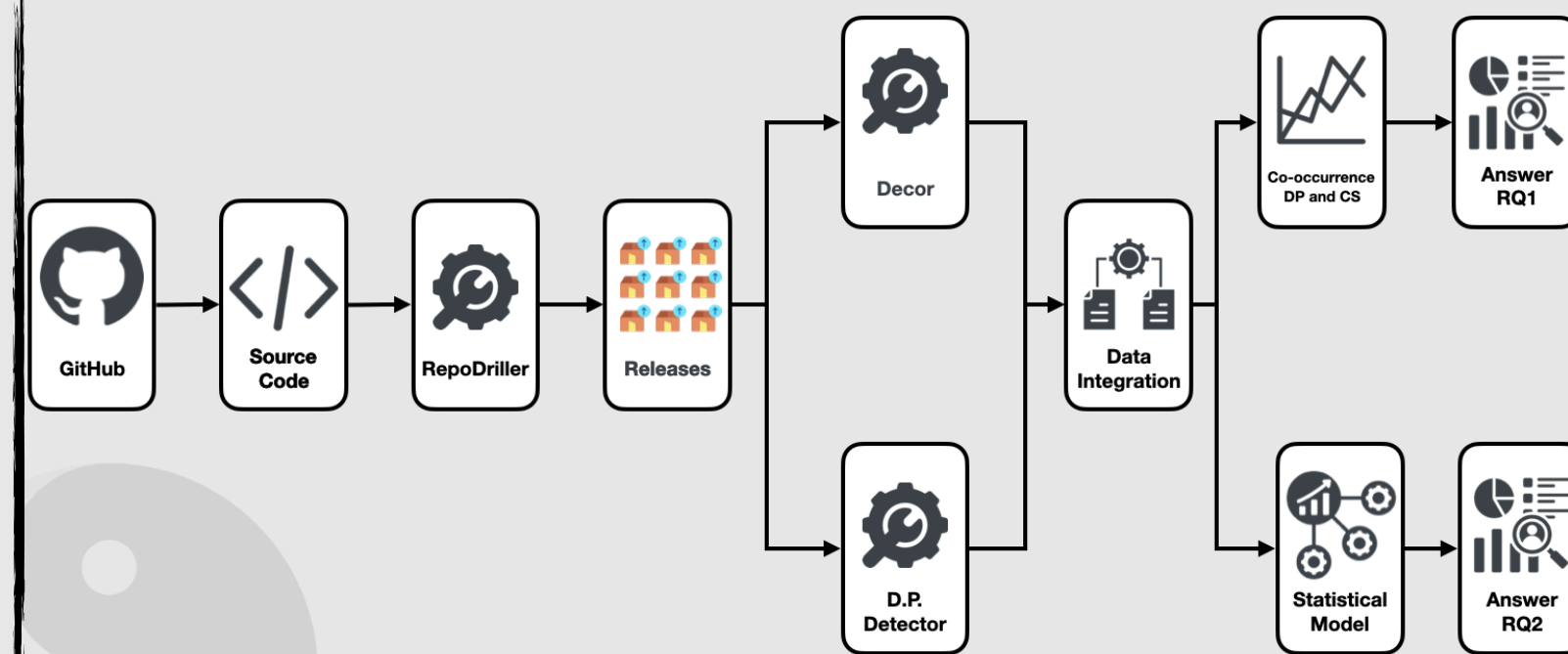
Understand the developers' perspective on the impact of Design Pattern on Code Smells

Understand how developers implemented Design Patterns to evaluate the correctness

Goal

investigating **whether** and **how** **design patterns** are **related** to the **emergence** of issues compromising code **understandability**

Research Process



46%

are **no instances** of classes that participate in **design patterns** and **simultaneously** are affected by **code smells**

54%

are **instances** of classes that participate in **design patterns** and **simultaneously** are affected by **code smells**

60%

 of projects

We found that the implementation of **design patterns** determined the **presence** of **code smells** in a **statistically significant** way



SCAN ME!
I'm the paper



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@giammariagiord1