

# Design Pattern Decay

A Study of Design Pattern Grime and Its Impact on Quality and Technical Debt

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# Technical Debt

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## 2012 - CAST Research Group Findings

In an analysis of 745 applications comprising 365 MLOC, on average, there is **\$3.61 of Technical Debt per LOC**

# Technical Debt

## Definition

*“In software intensive systems, technical debt—is a design or implementation construct that is expedient in the short term, but sets up a technical context that can make a future change more costly or impossible. Technical debt is a contingent liability whose impact is limited to internal system qualities, primarily maintainability and evolvability”<sup>a</sup>*

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- **Principal** - The effort required to refactor the software and remove the debt.

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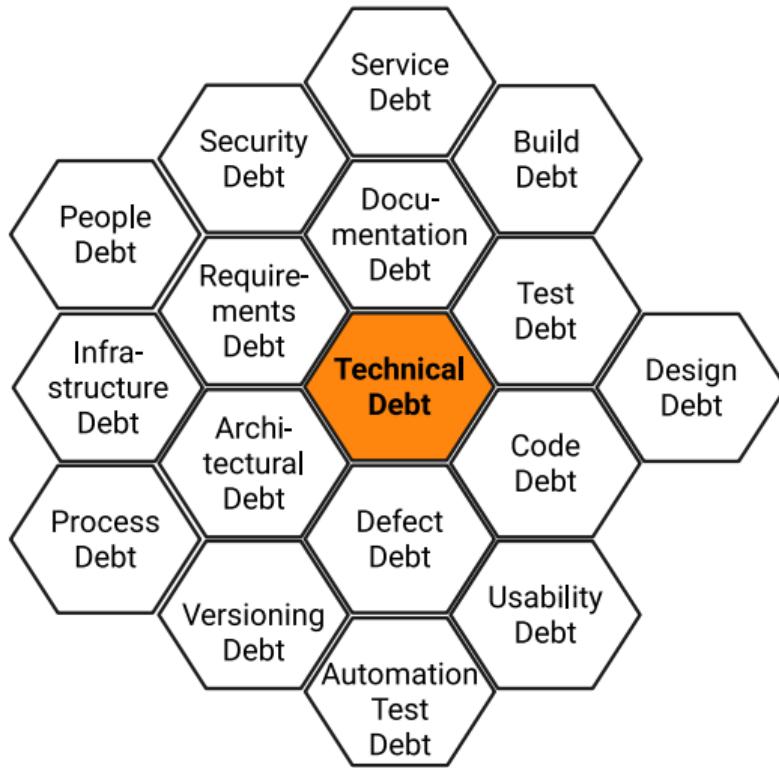
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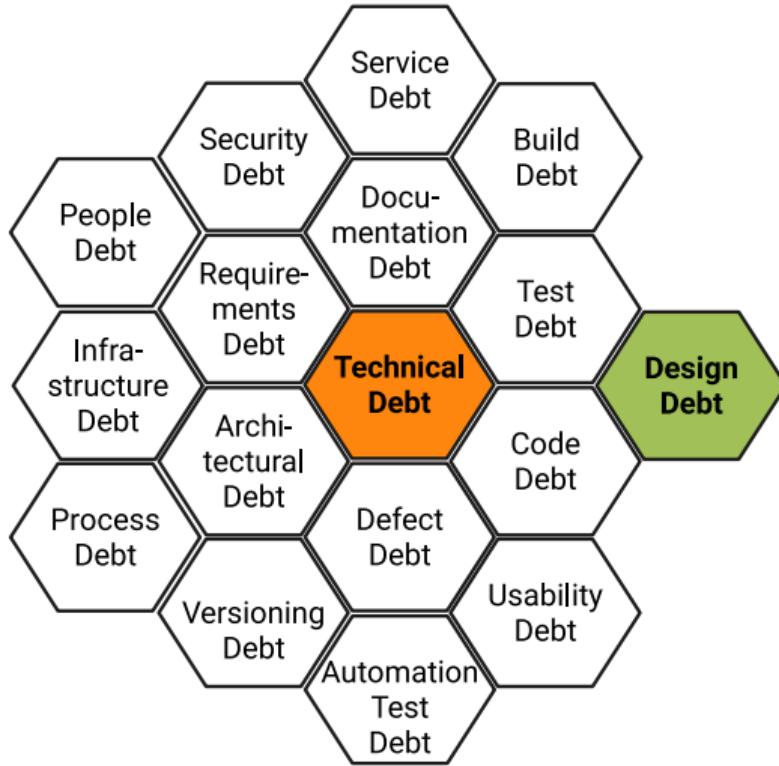
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- **Interest** - The increase in development effort caused by debt affected components which have yet to be refactored.

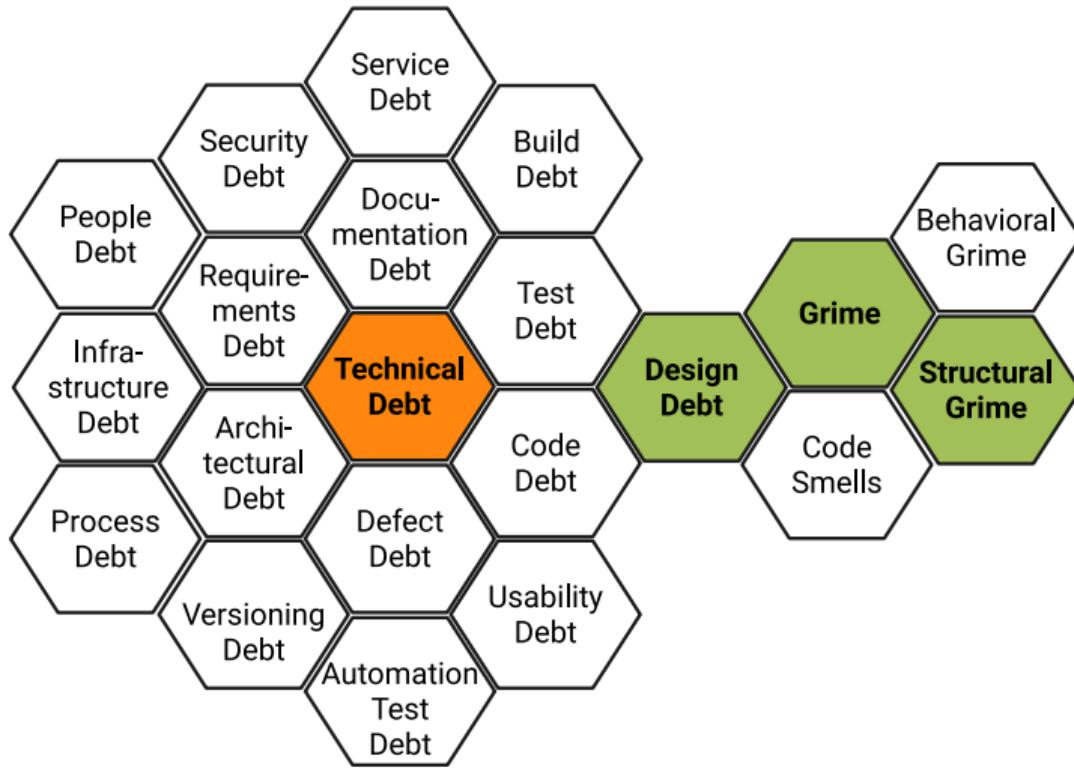
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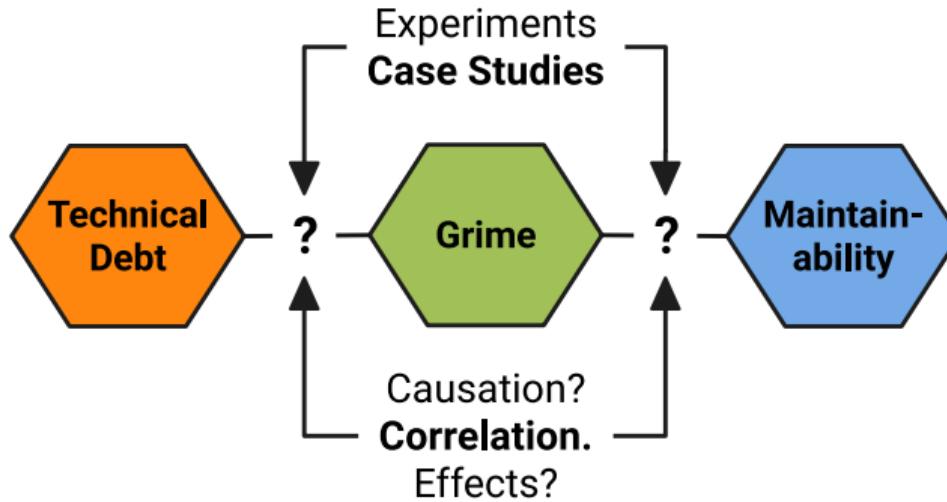
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- ▶ Buildup of errant behavioral elements within a pattern instance (i.e. Excessive Actions or Improper Order of Sequences)

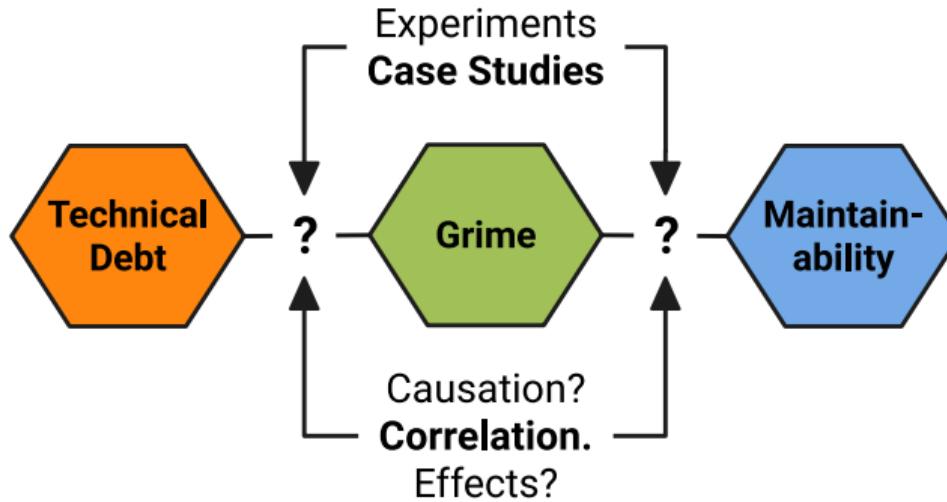
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*What is the nature of the relationships between structural design pattern grime, software maintainability, and technical debt measurement?*

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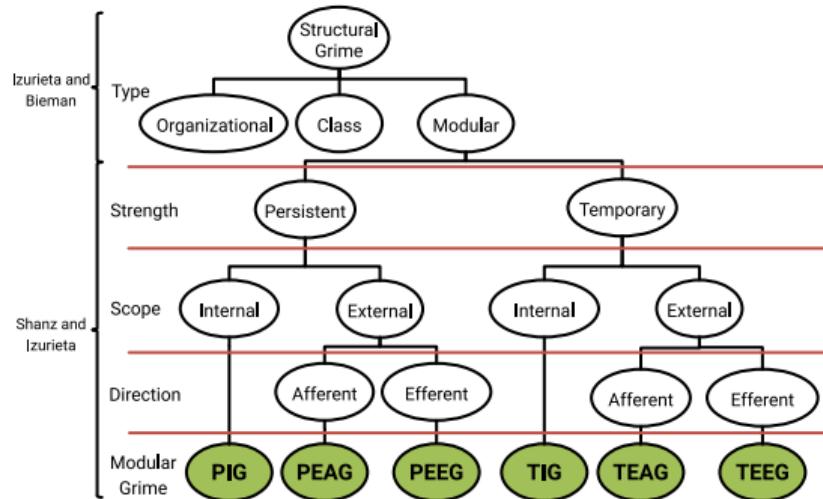
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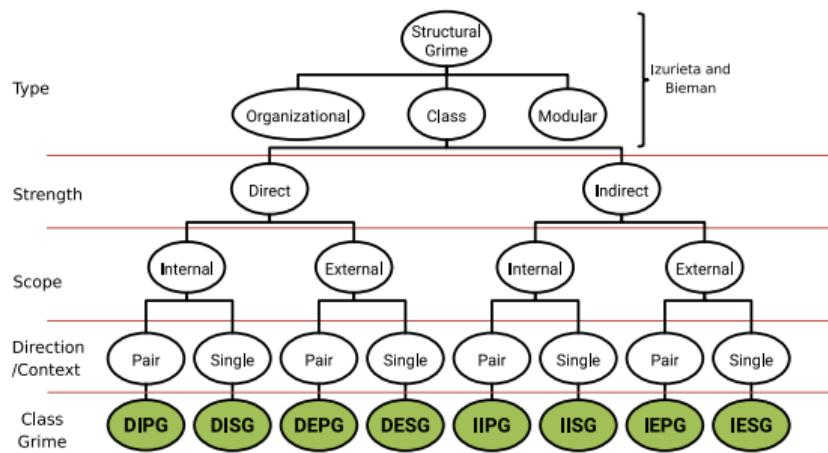
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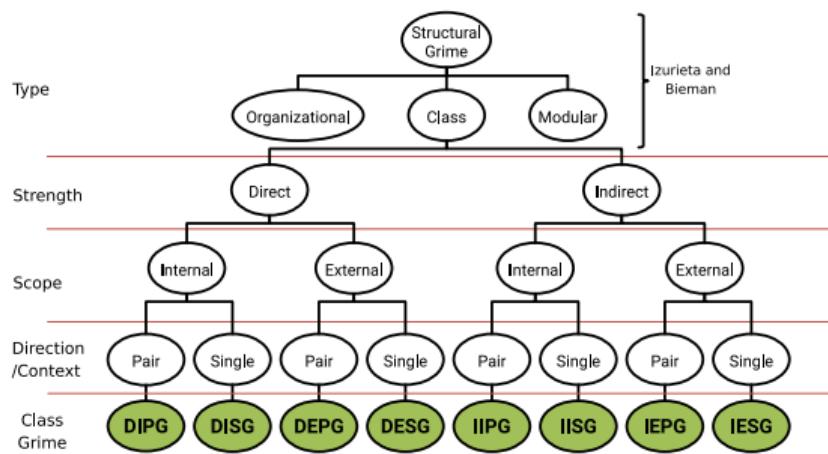
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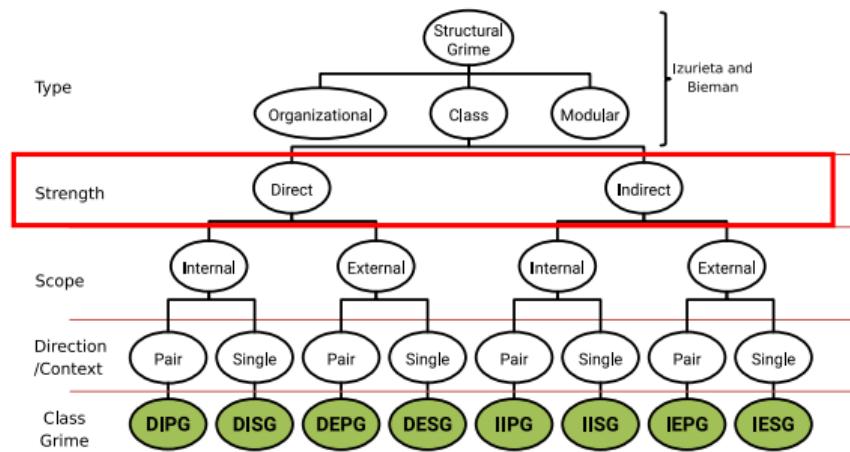
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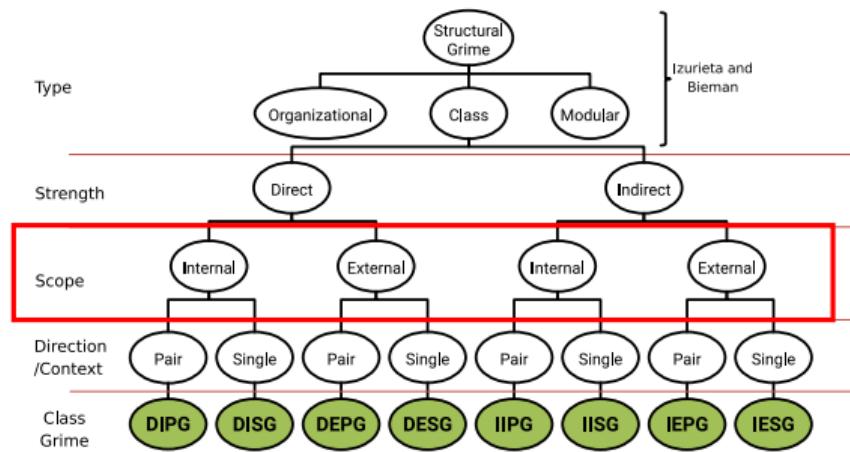
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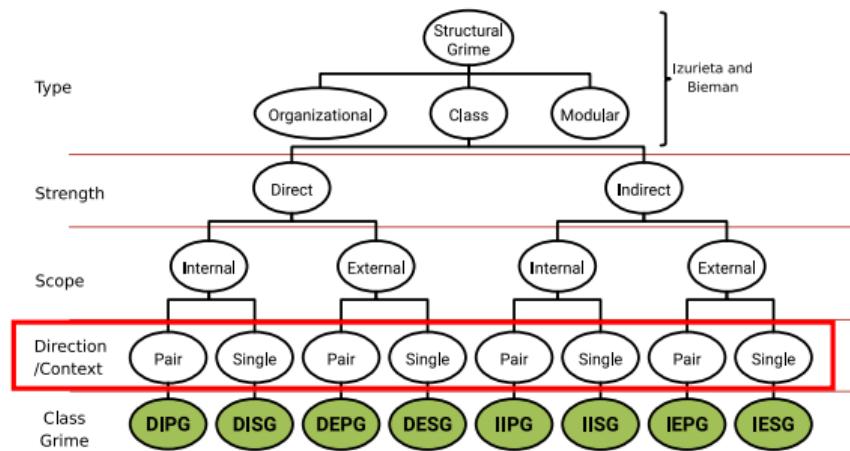
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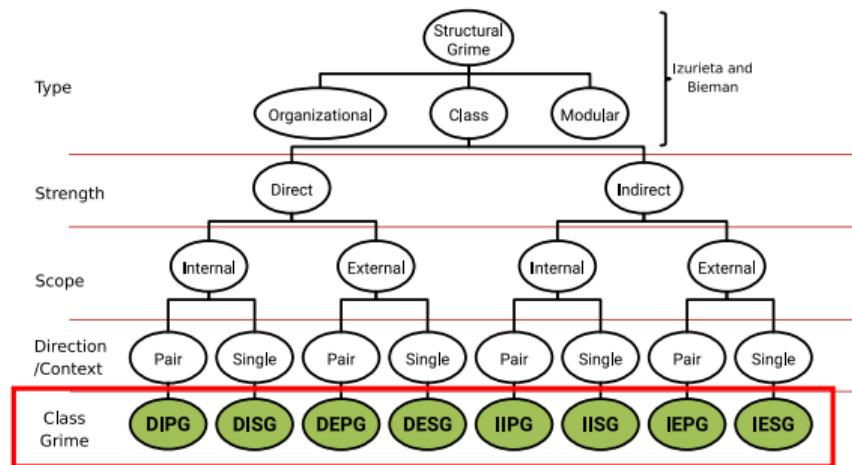
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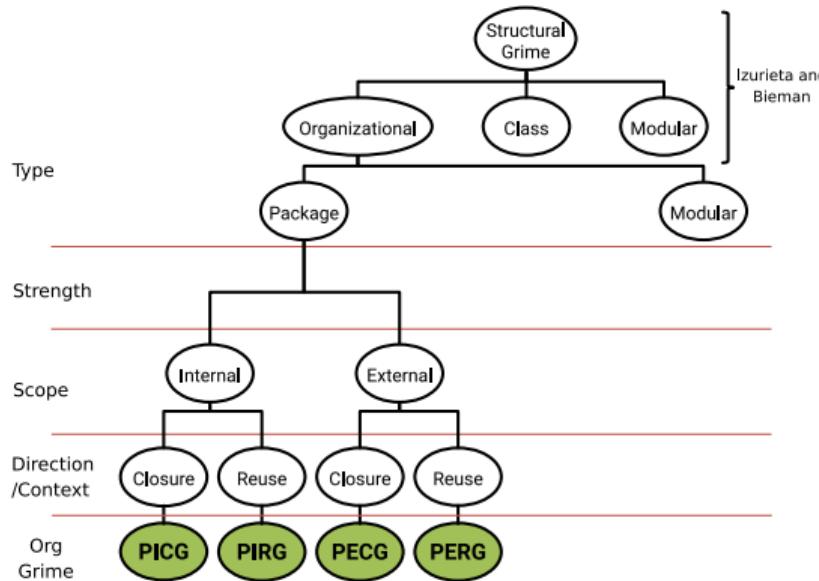
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  - ▶ Pair: Tight Class Cohesion (TCC)
  - ▶ Single: Ratio of Cohesive Interactions (RCI)

# Package Organizational Grime

RQ1.2: What are the types of Organizational Grime?

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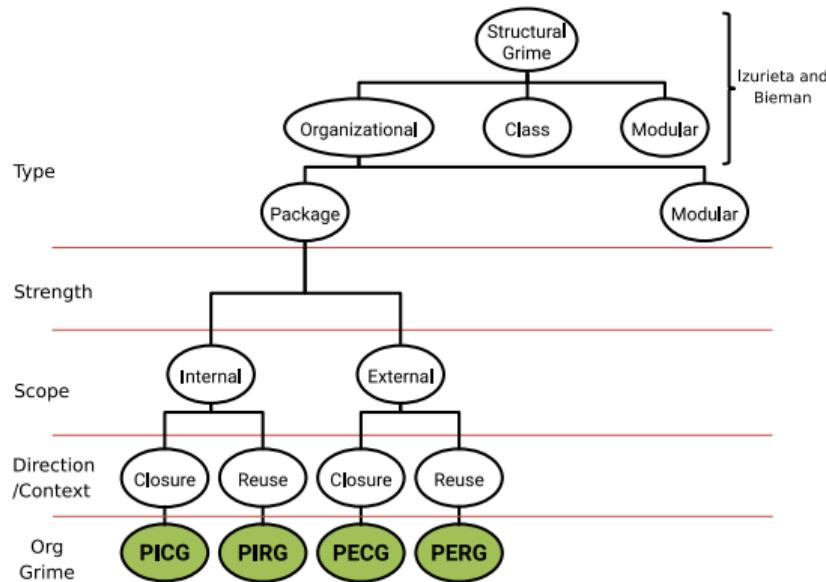


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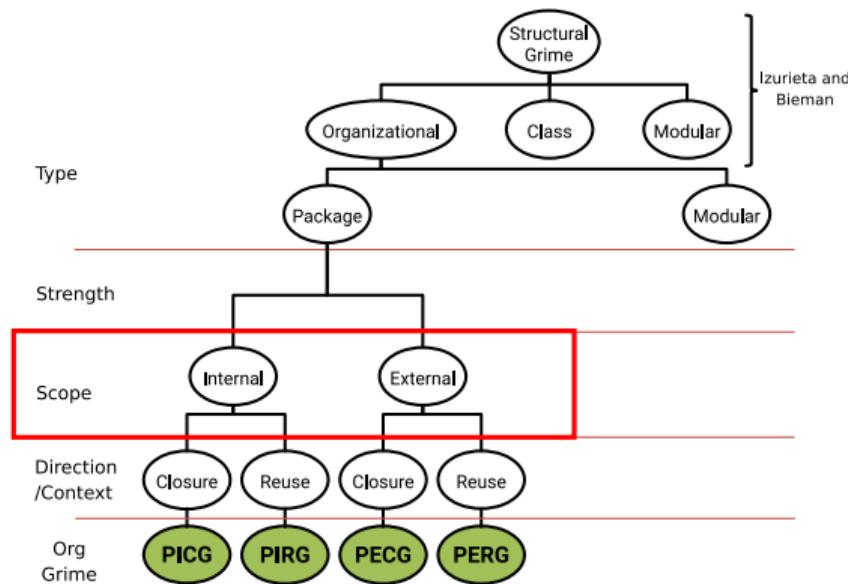
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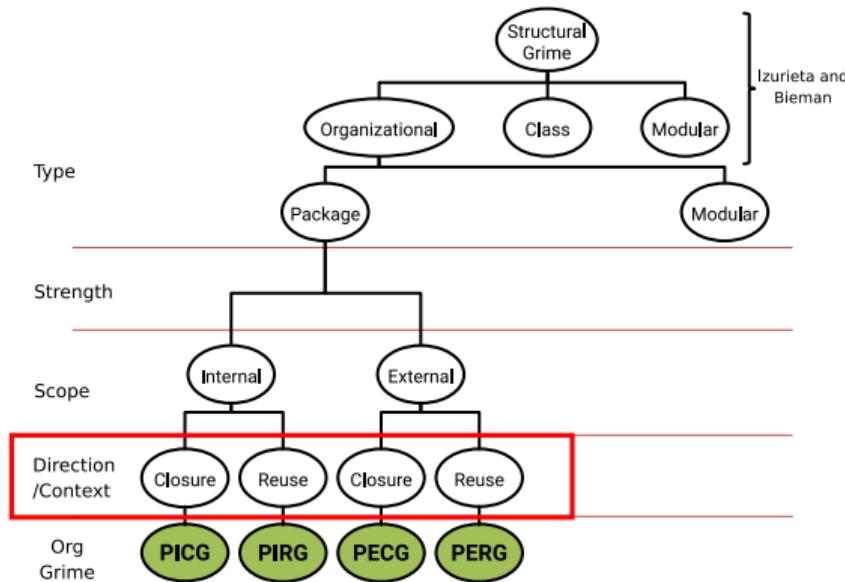
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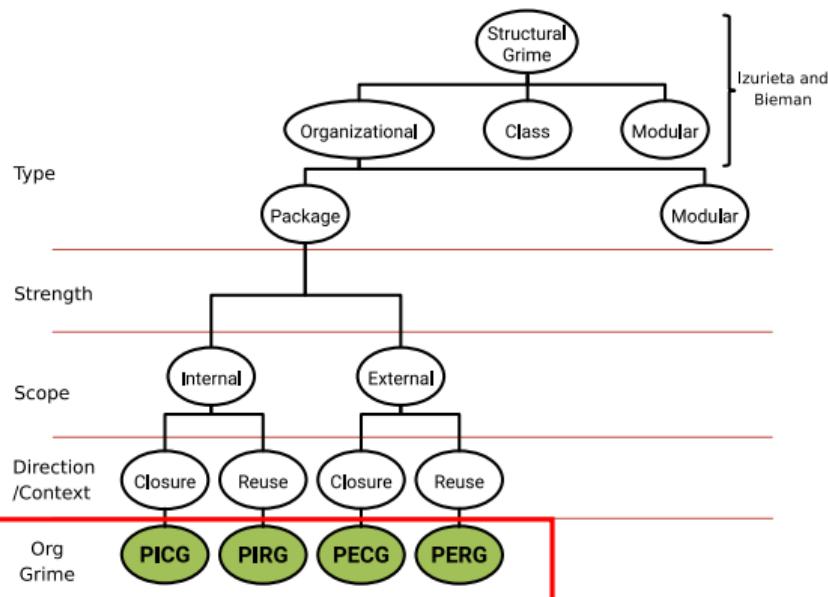
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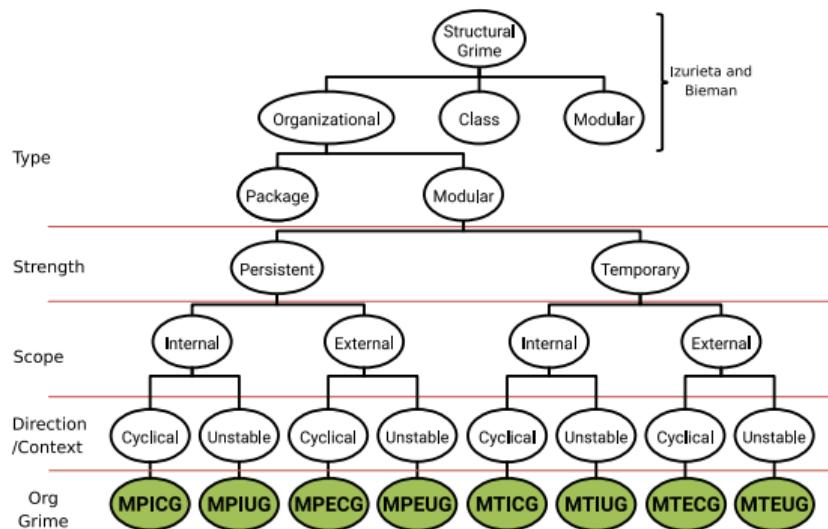
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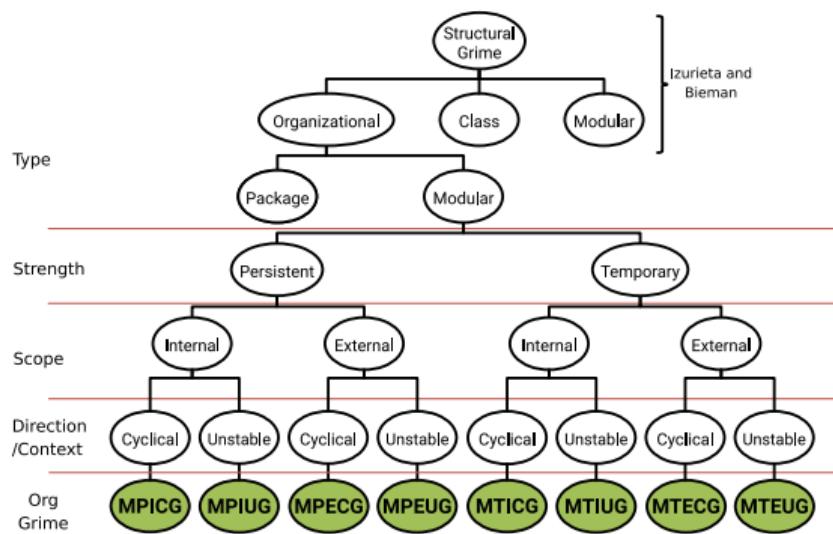


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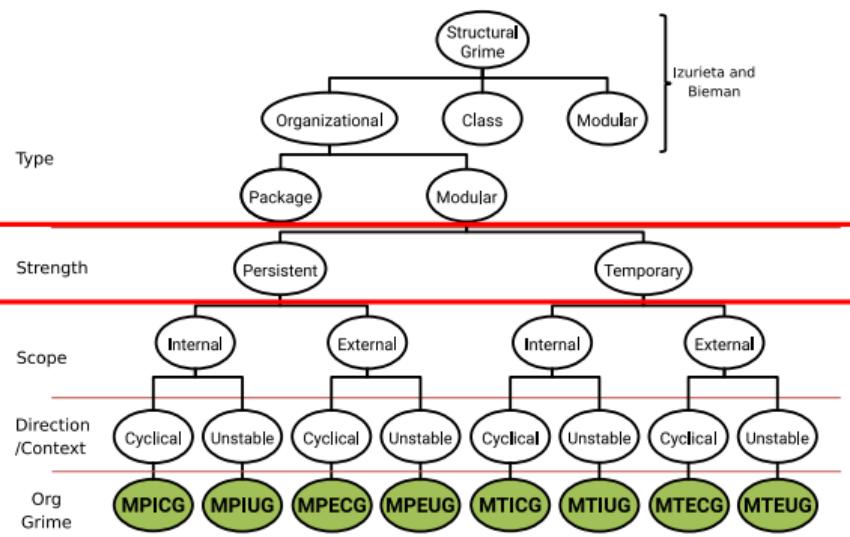
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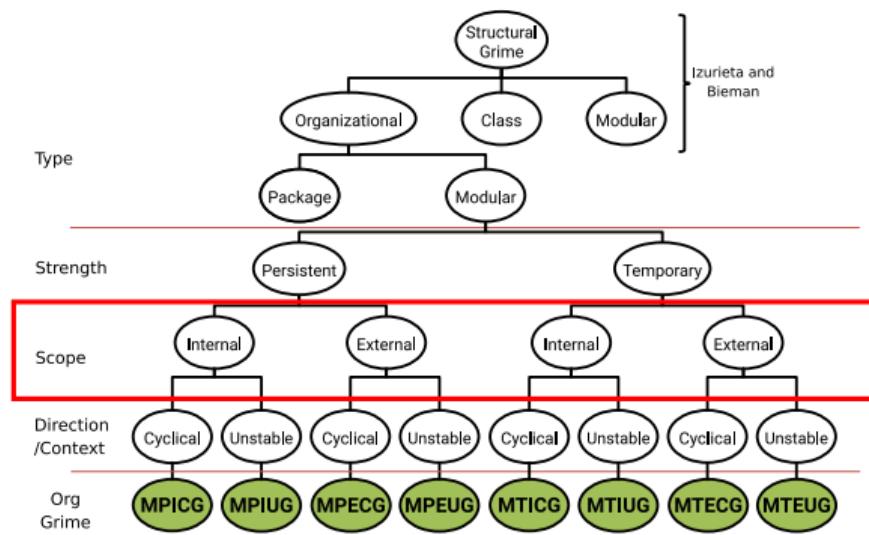
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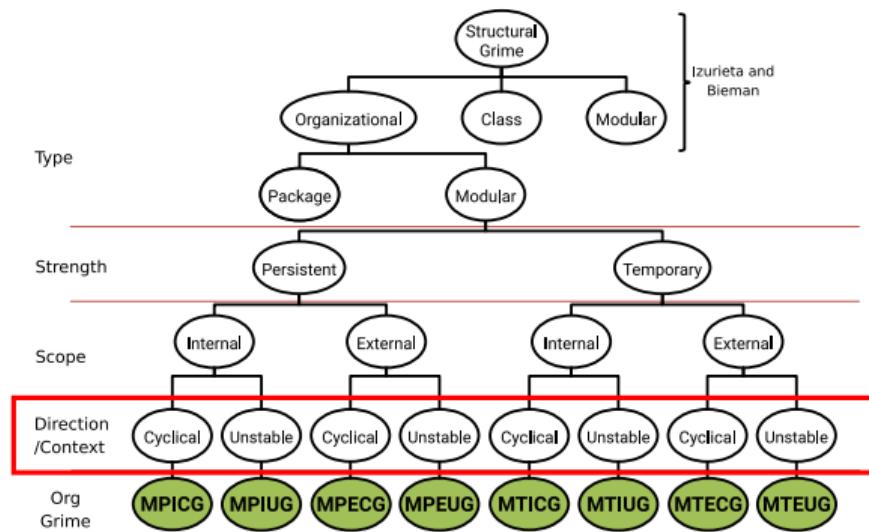
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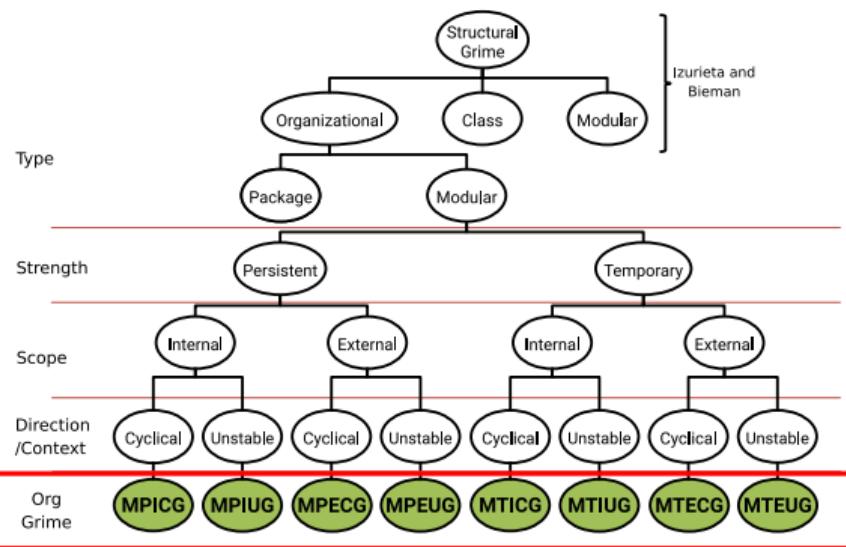
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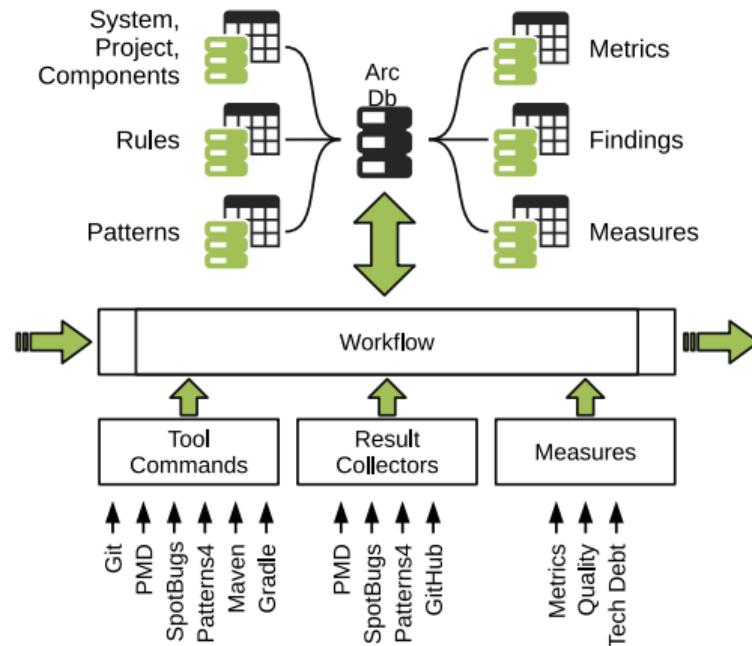
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DP1: How can we conduct a full-factorial experiment to evaluate the relationship between grime and quality and grime and technical debt when we are unsure how often design pattern grime occurs?

# The Arc Framework

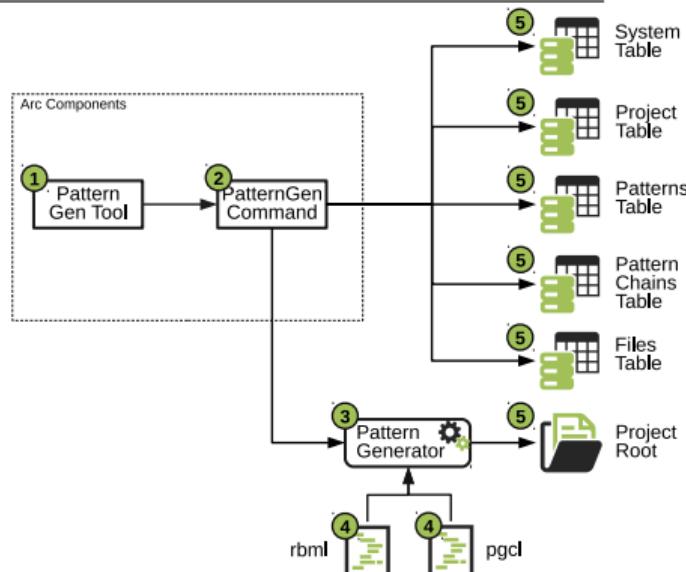
DP1.1 How do we automate the data collection and experimentation process?



# Pattern Generation and Grime Injection

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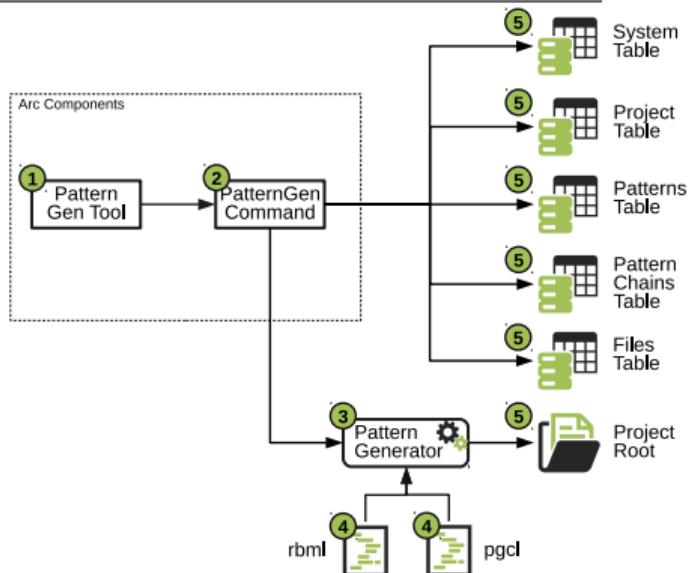
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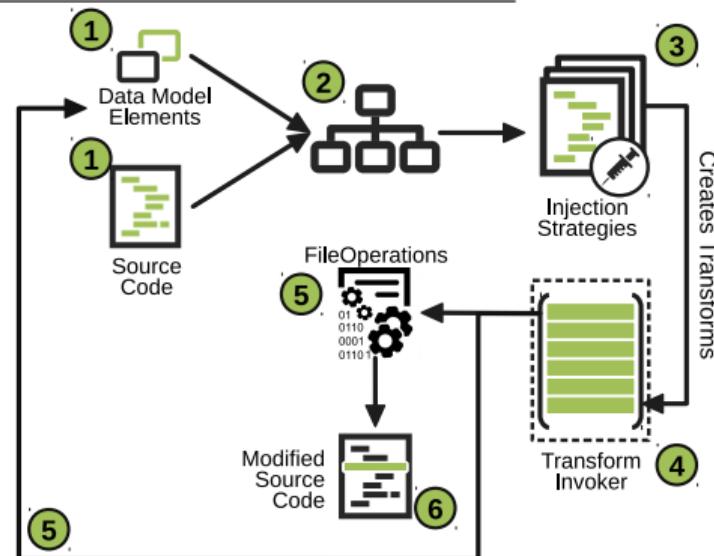
# Pattern Generation and Grime Injection

DP1.3 How can we ensure design patterns have the correct type of grime?

## Pattern Generation Integration:



## Grime Injection Operation:



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DP1.4 How do we measure the quality of a pattern instance?

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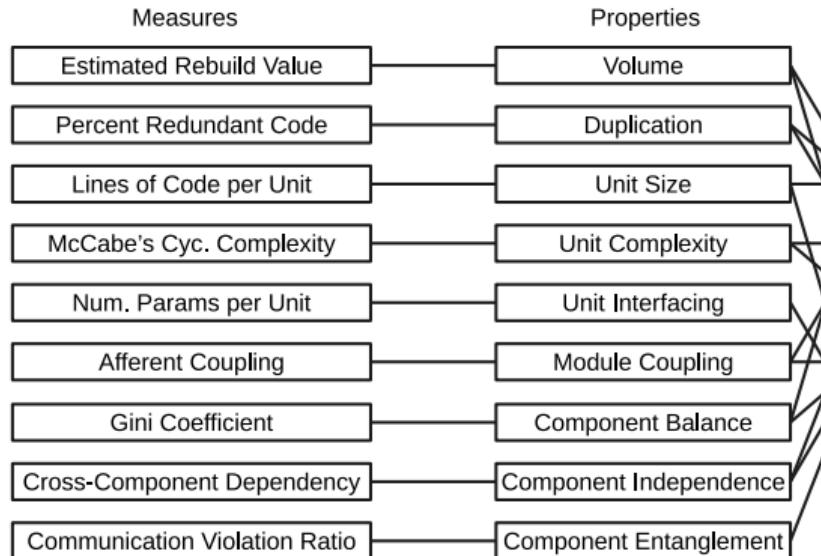
### Measures

- Estimated Rebuild Value
- Percent Redundant Code
- Lines of Code per Unit
- McCabe's Cyc. Complexity
- Num. Params per Unit
- Afferent Coupling
- Gini Coefficient
- Cross-Component Dependency
- Communication Violation Ratio

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# Measuring Software Quality

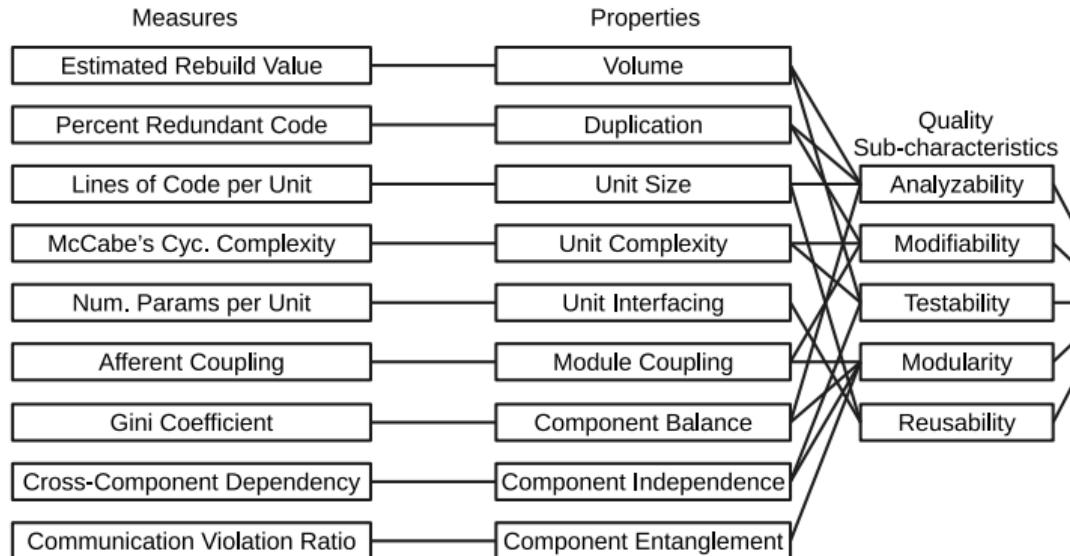
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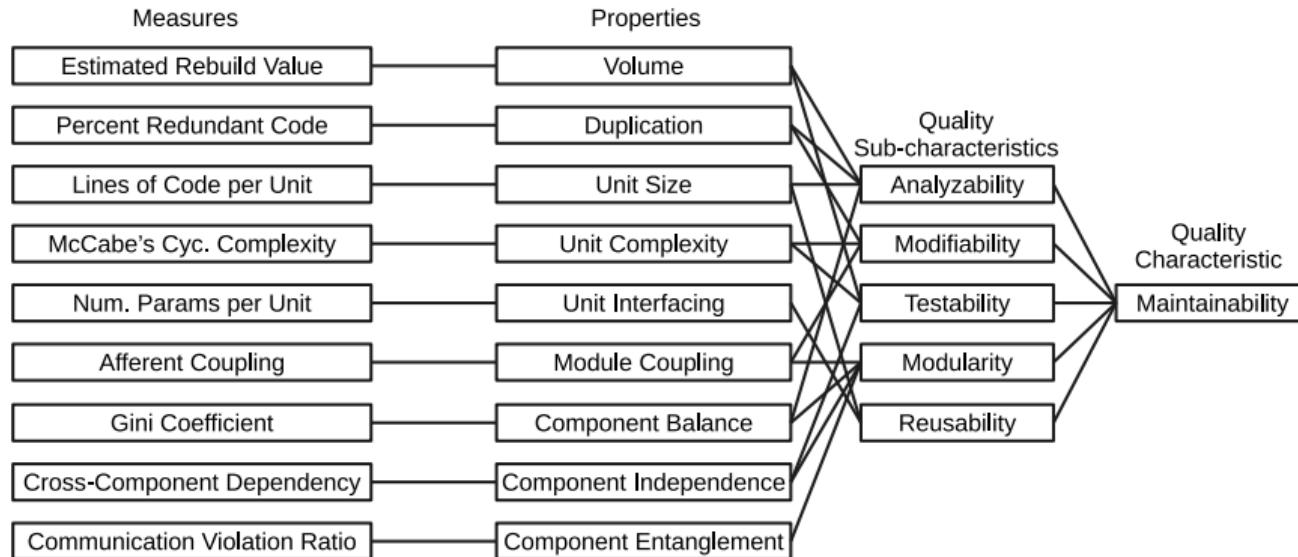
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## Nugroho et al.'s Calculations

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$$RE = RF * RV * RA$$

- ▶ Rebuild Value,  $RV = SS * TF$
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- TD Interest (TDI):

$$TDI = ME_I - ME_C$$

- ▶  $ME_I$  = Maintenance Effort at Ideal Quality Level
- ▶  $ME_C$  = Maintenance Effort at Current Quality Level

$$ME = \frac{MF * RV}{QF}$$

- ▶  $MF$  = yearly maintenance effort of the system (0.15)
- ▶  $RV$  = Rebuild Value
- ▶  $QF$  = Quality Factor

$$QF = 2^{((QualityLevel-3)/2)}$$

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  - ▶ RQ2(3).3: What is the difference between the effects of the grime types and their subtypes on maintainability sub-characteristics (technical debt principal and interest)?

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Level	Max % Grime Injected
0	0% (Control)
1	$\leq 15\%$
2	$\leq 30\%$
3	$\leq 45\%$
4	$\leq 60\%$
5	$\leq 75\%$

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  - ▶ 26 Grime Types for Injection
  - ▶ 16 Design Pattern Types
  - ▶ 6 Levels of Injection Severity

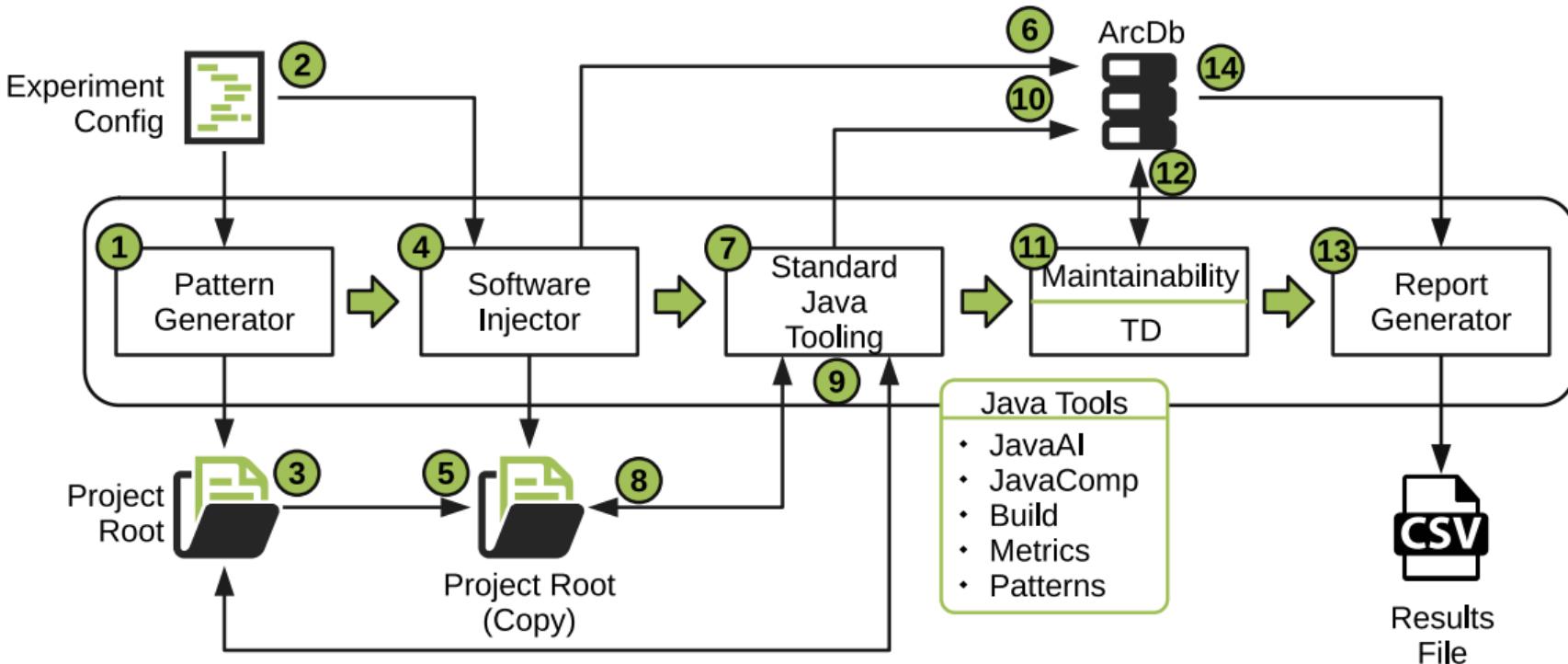
Pattern Types	
Adapter	Observer
Bridge	Prototype
Chain of Responsibility	Proxy
Command	Singleton
Composite	State
Decorator	Strategy
Flyweight	Template Method
Factory Method	Visitor

Level	Max % Grime Injected
0	0% (Control)
1	$\leq 15\%$
2	$\leq 30\%$
3	$\leq 45\%$
4	$\leq 60\%$
5	$\leq 75\%$

## Analysis:

- Each experiment was analyzed using a Permutation F-Test
- Followed by an analysis of interactions between Pattern Type, Injection Type and Injection Severity
- Here we present 3 of the 7 Experiments

# Data Collection

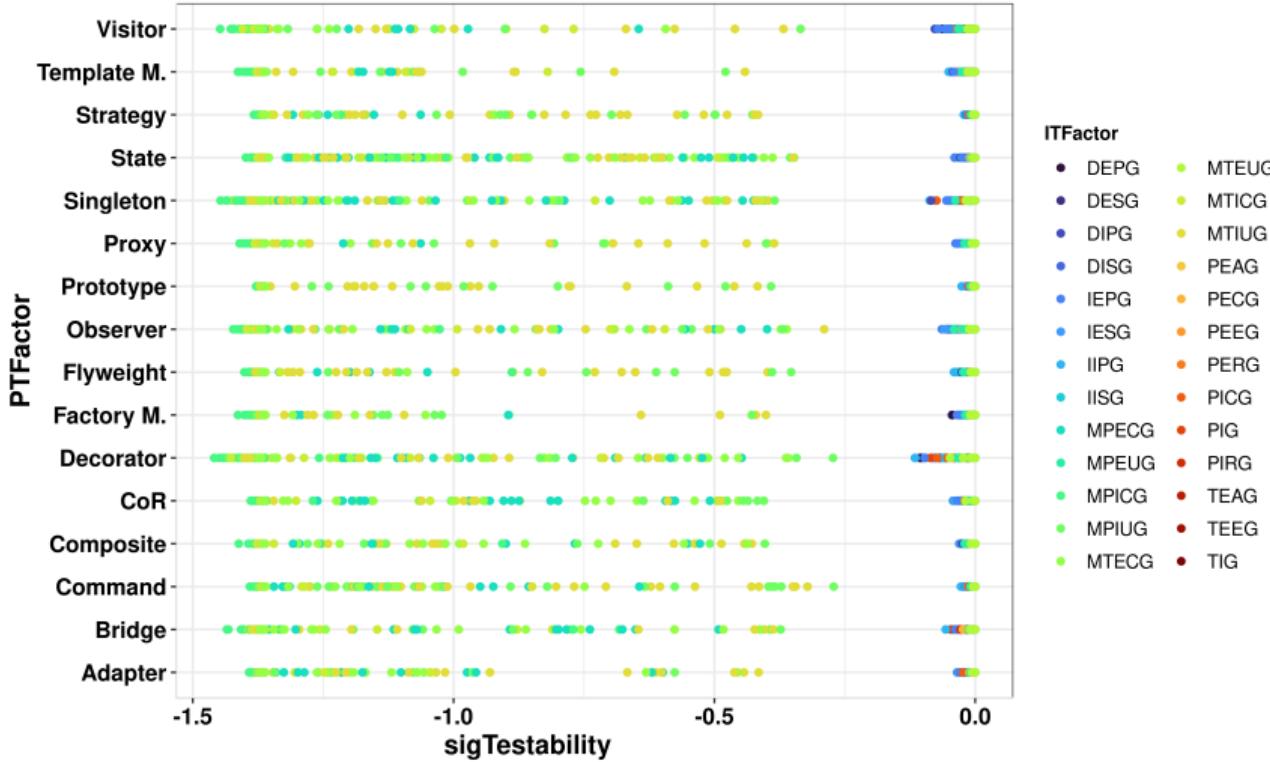


# Testability

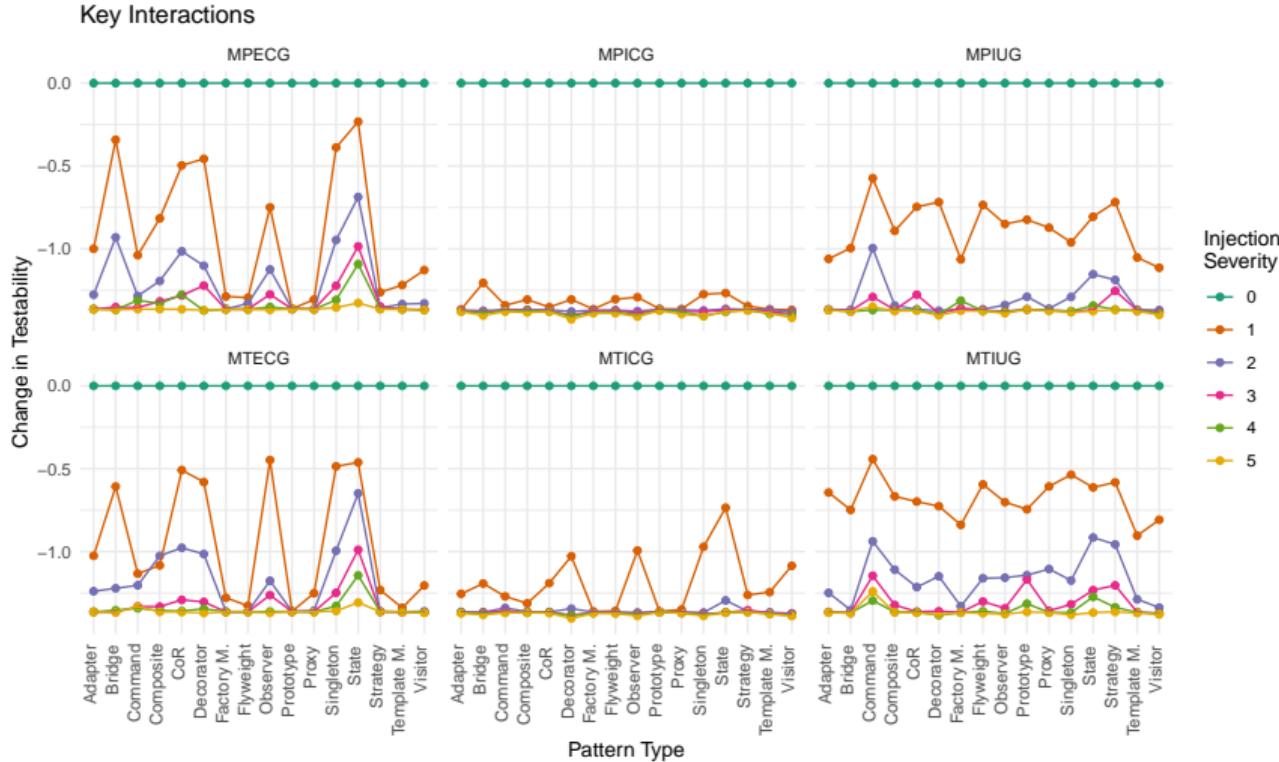
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## Experiment

# Testability



# Testability

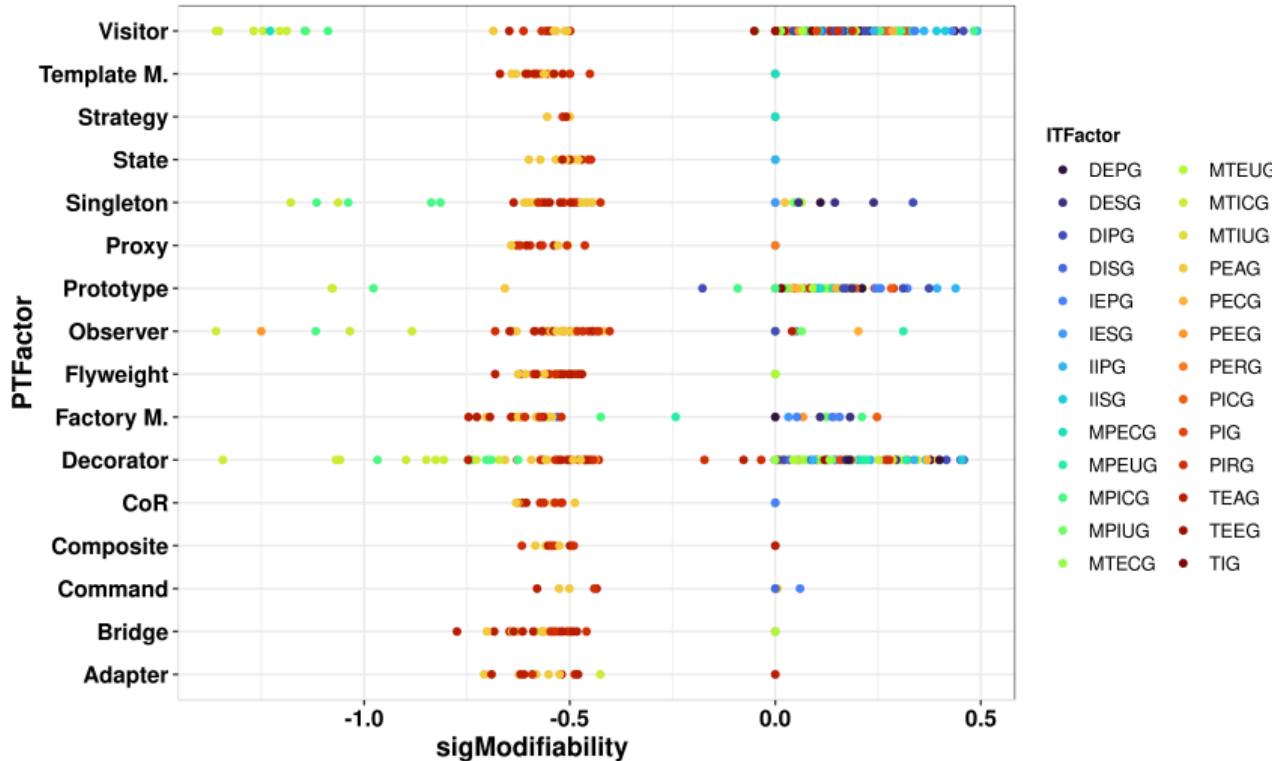


# Modifiability

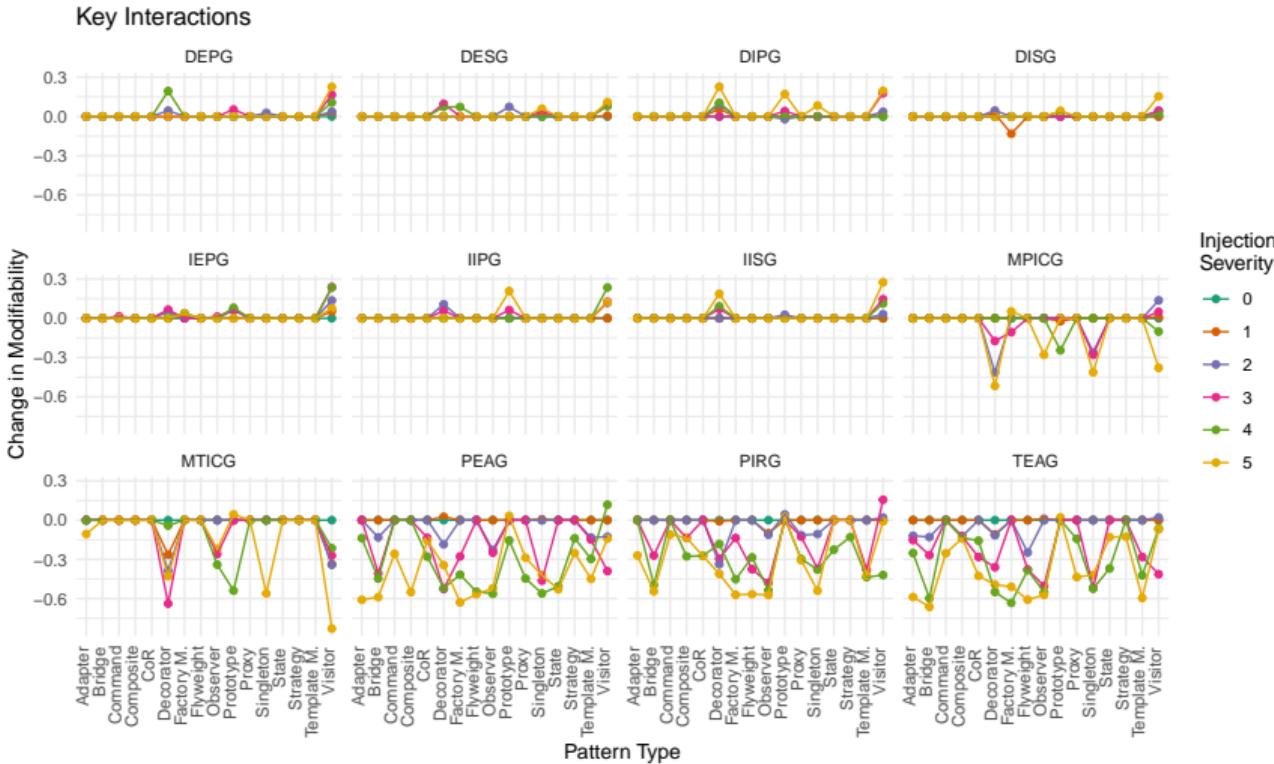
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Experiment

# Modifiability



# Modifiability

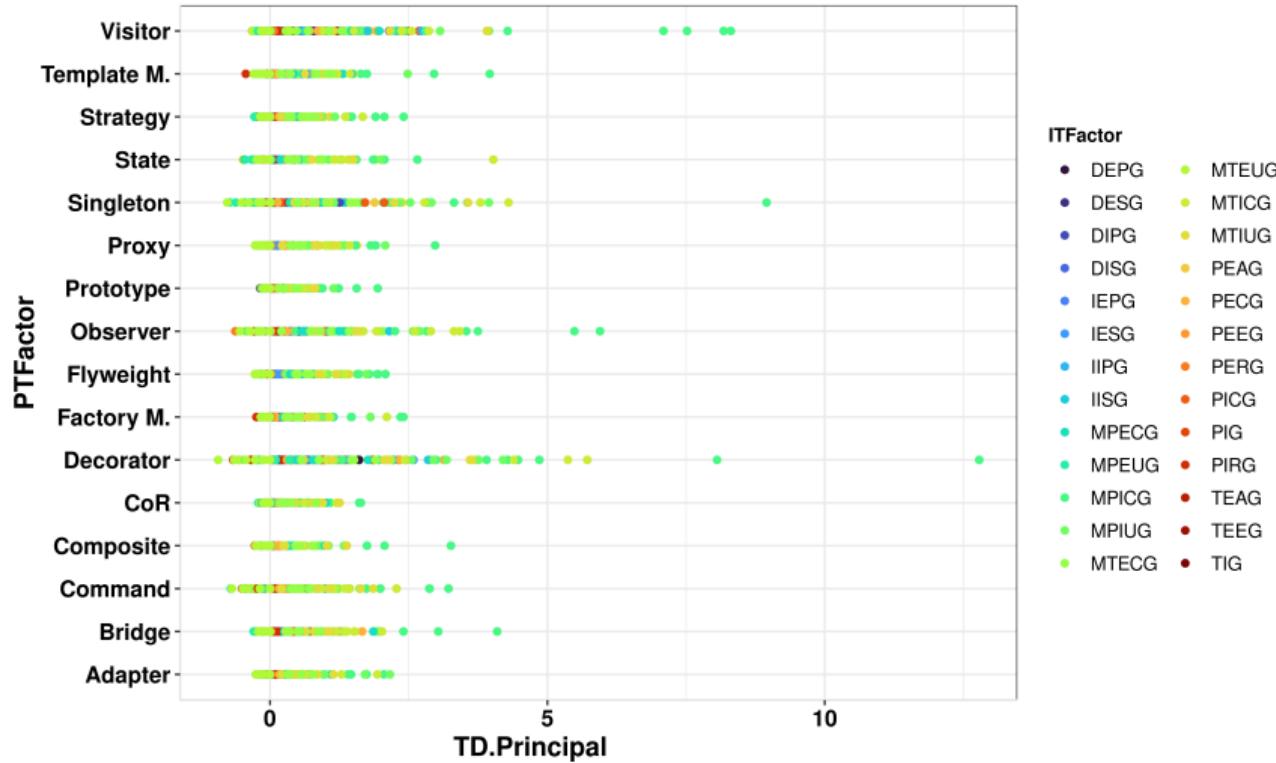


# TD Principal

---

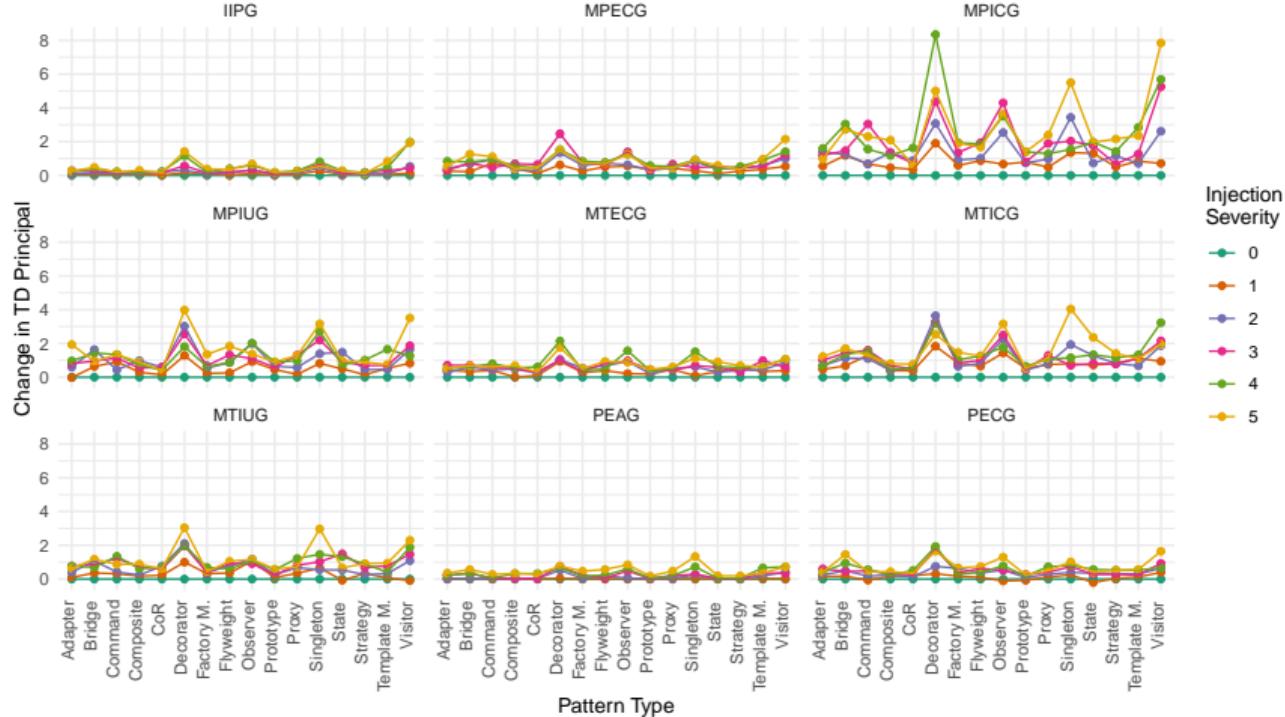
## Experiment

# TD Principal



# TD Principal

Key Interactions



# Phase 03 - Verification Study

**RG4:** Analyze design pattern instances for the purpose of comparing injected and observed instances of grime with respect to their ISO/IEC 25010 Maintainability subcharacteristics attributes and Technical Debt Principal and Interest from the perspective of researchers in the context of open source Java™ software projects.

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RG4: Analyze design pattern instances for the purpose of comparing injected and observed instances of grime with respect to their ISO/IEC 25010 Maintainability subcharacteristics attributes and Technical Debt Principal and Interest from the perspective of researchers in the context of open source Java™ software projects.



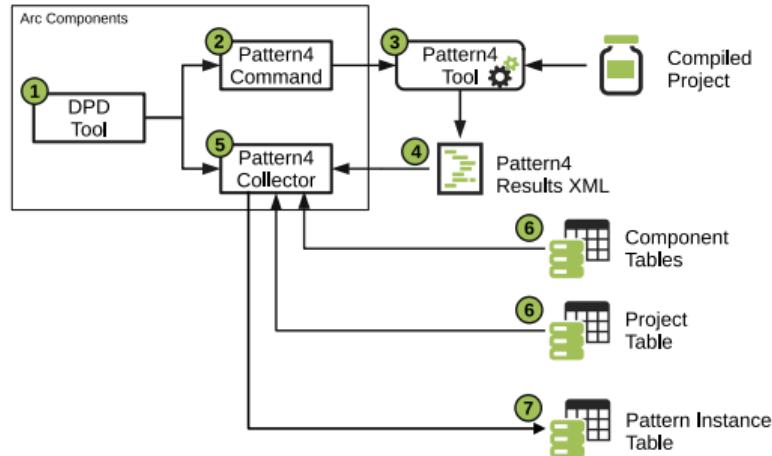
DP2: How do we verify the results of the experiments with real software?

# Design Pattern Detection

DP2.1: How do we incorporate design pattern detection into the Arc Framework?

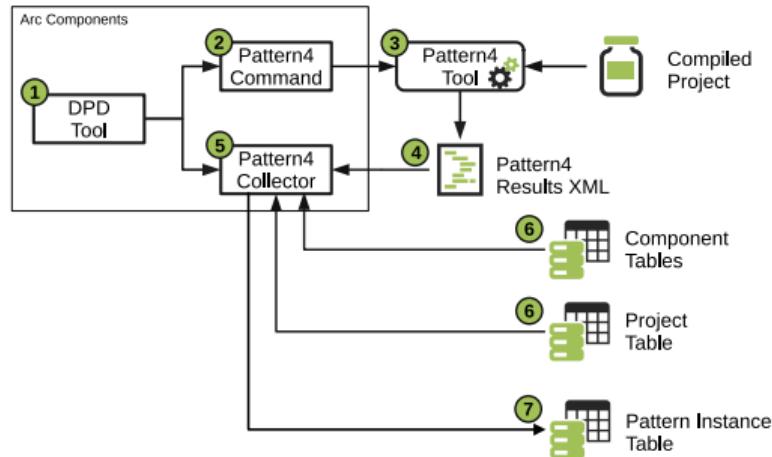
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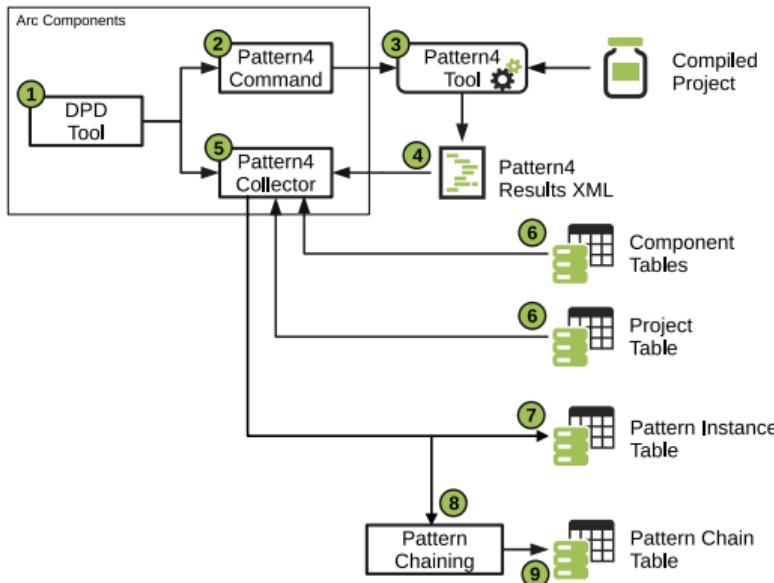
# Design Pattern Detection

DP2.2: How do we track instances of design patterns across versions of a software system?



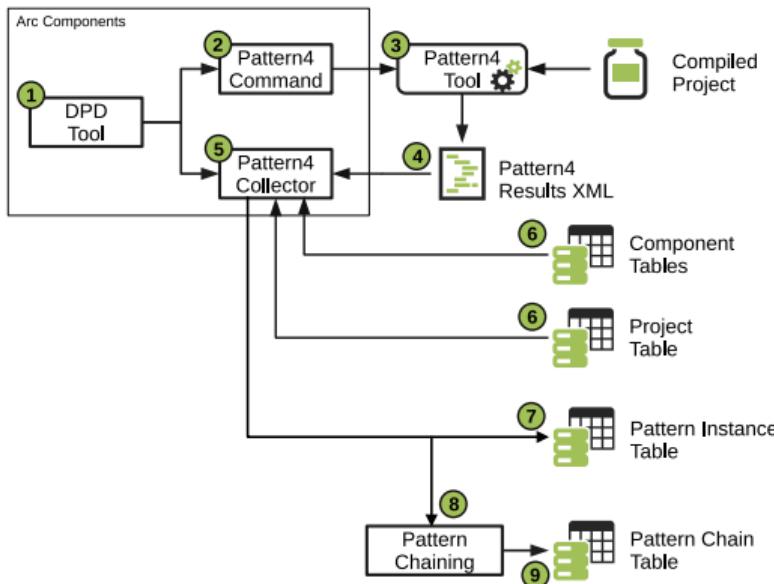
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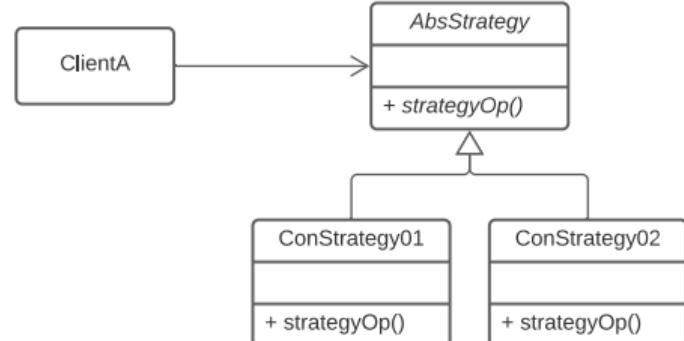


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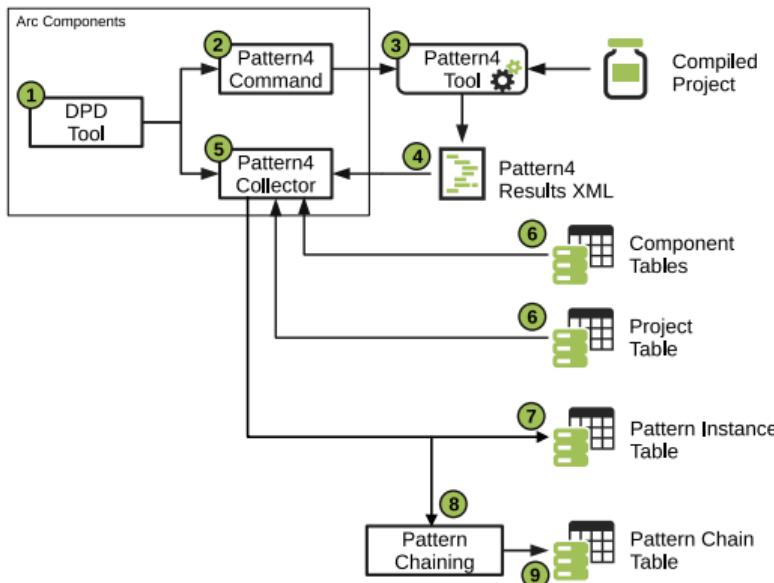


Version: 1.0  
Pattern: Strategy-01

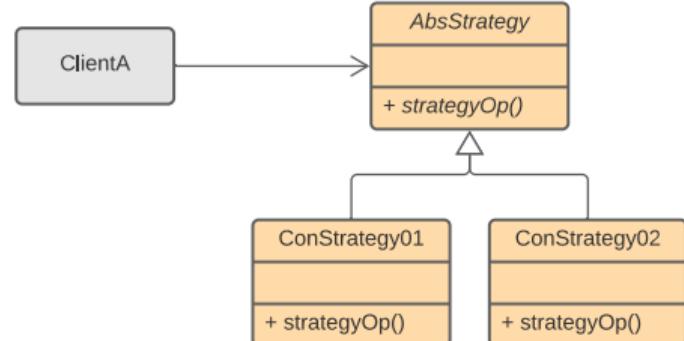


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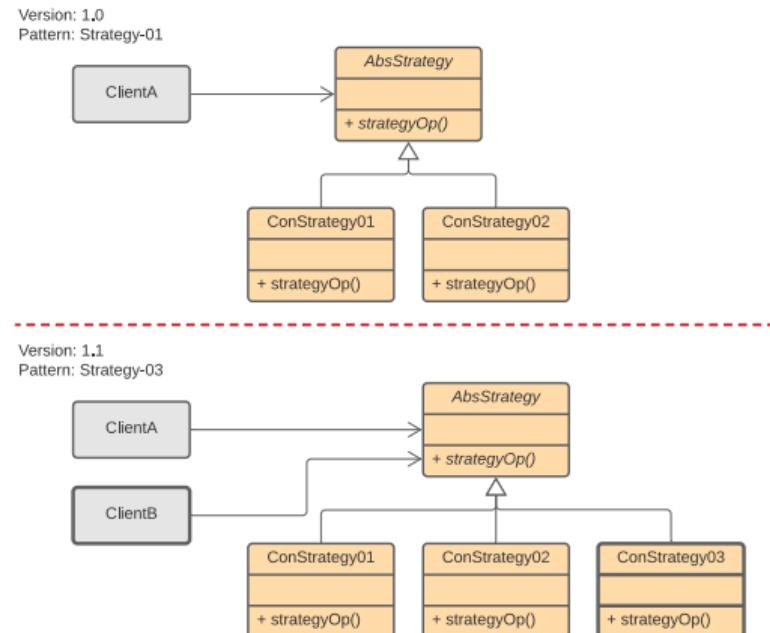
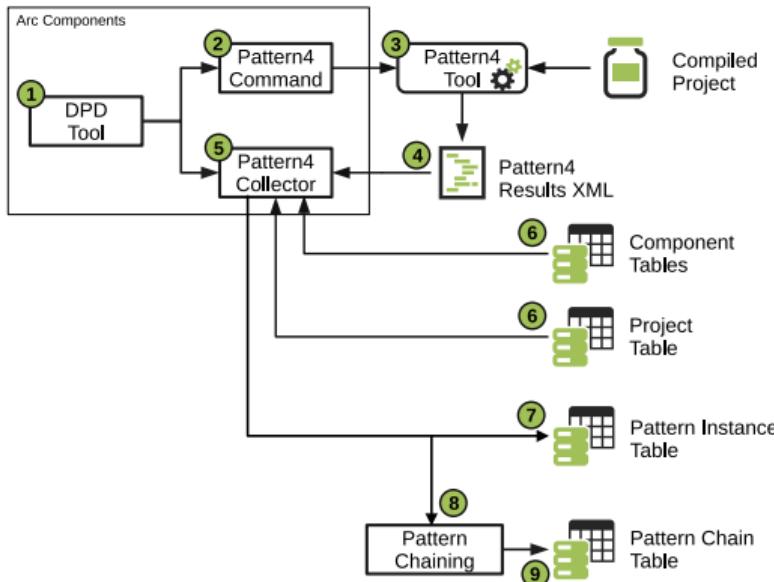


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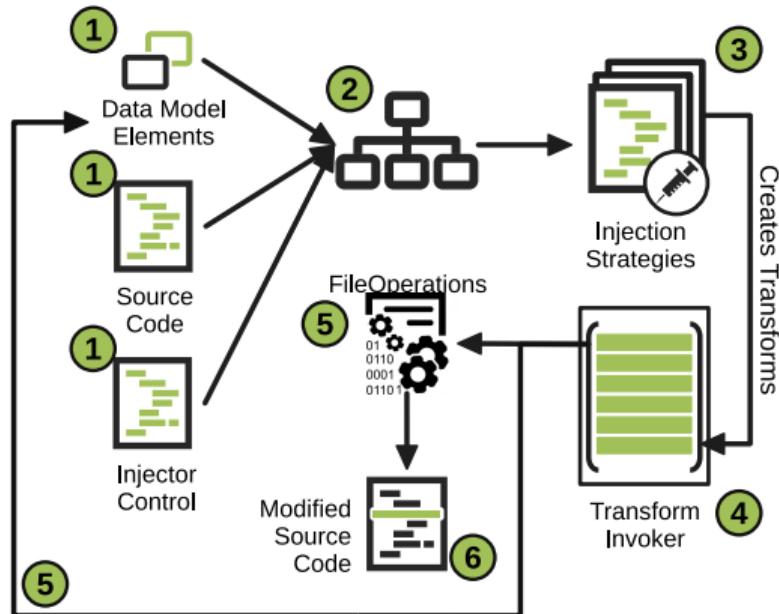
# Design Pattern Detection

DP2.2: How do we track instances of design patterns across versions of a software system?



# Controlled Injection

DP2.3: How do we modify the Software Injector to allow for controlled injection to mimic the change in grime that occurred between versions?

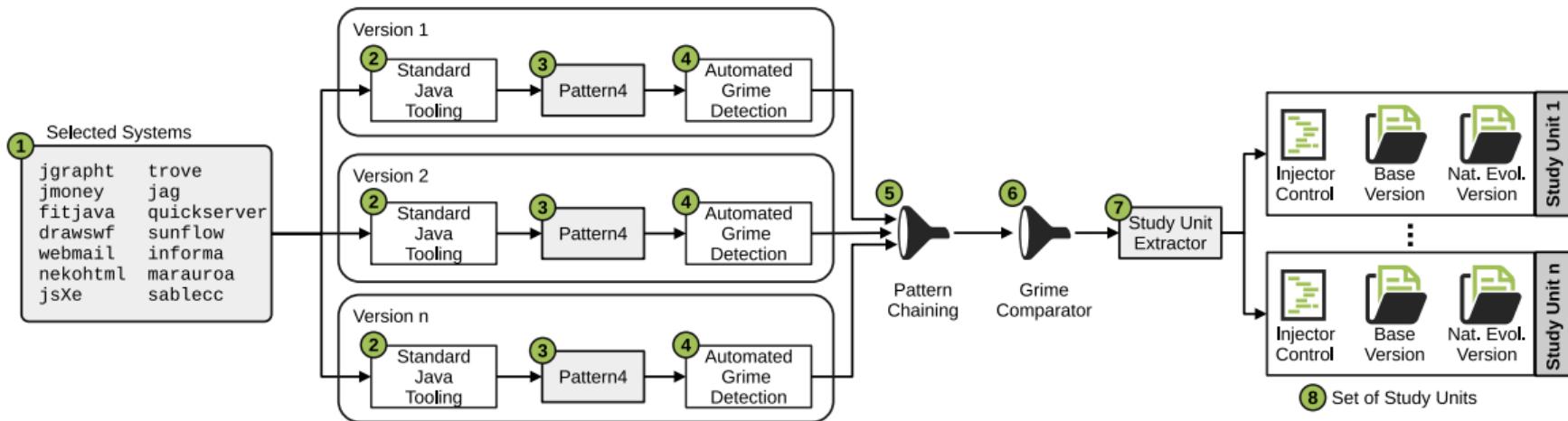


# Research Questions

RQ4: Do observed and injected grime have a similar effect on the Maintainability sub-characteristics and Technical Debt Principal and Interest?

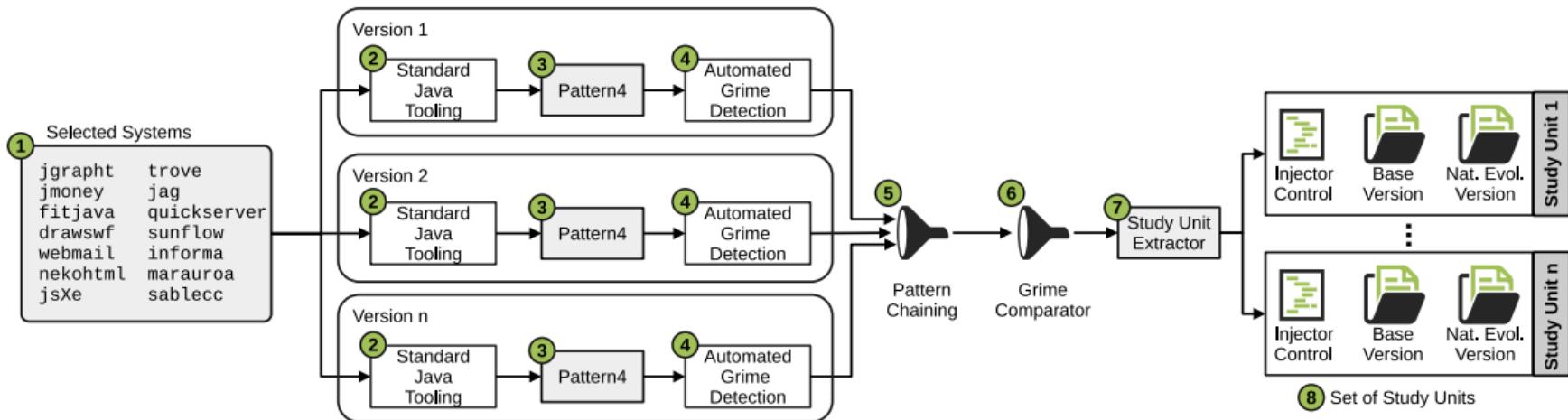
# Data Collection (1)

## Phase 1: Study Unit Extraction



# Data Collection (1)

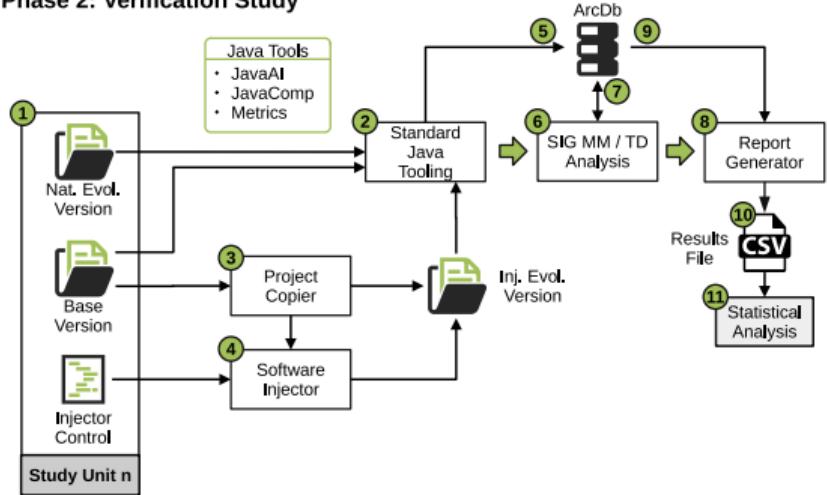
## Phase 1: Study Unit Extraction



Total units found: 8

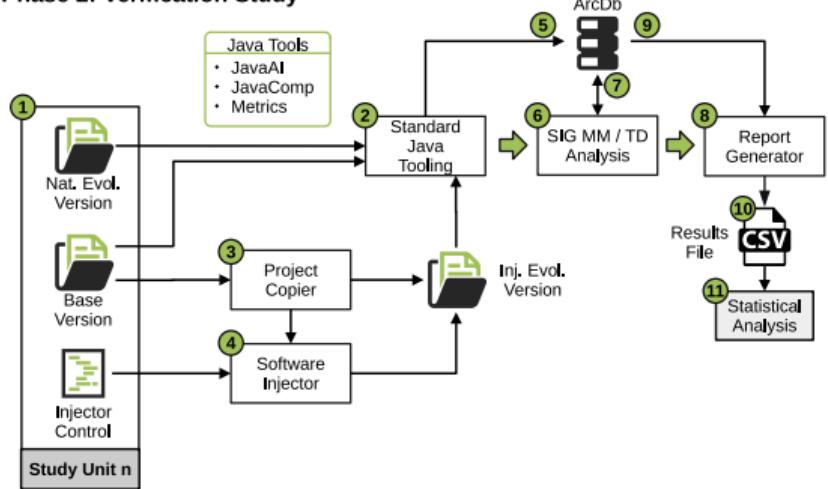
# Data Collection (2)

## Phase 2: Verification Study



# Data Collection (2)

## Phase 2: Verification Study



- Next we map the change in each characteristic,  $\Delta c$  to a nominal scale for comparison:

$$map(\Delta c) = \begin{cases} L & \text{if } \Delta c < 0 \\ E & \text{if } \Delta c = 0 \\ G & \text{if } \Delta c > 0 \end{cases}$$

Where  $\Delta c$  is the difference between:

- ▶ Natural Evolution and Base Version
- ▶ Injected Evolution and Base Version

# Results

	Study Units															
	1 - State		2 - State		3 - Sngltn		4 - Adapt		5 - TM		6 - TM		7 - State		8 - Sngltn	
	Nat	Inj	Nat	Inj	Nat	Inj	Nat	Inj	Nat	Inj	Nat	Inj	Nat	Inj	Nat	Inj
Ana	E	G	L	L	G	L	E	E	L	G	L	L	L	G	L	
Test	E	L	L	L	L	L	E	L	G	L	G	L	G	L	G	L
Modul	E	G	L	L	E	L	E	L	G	L	L	L	L	E	L	
Modif	E	E	E	E	E	E	E	G	G	G	G	E	E	G	G	
Reuse	E	G	G	G	G	L	E	L	G	L	G	L	L	L	L	
TDP	E	G	G	G	G	L	E	L	G	L	G	L	G	L	G	
TDI	E	G	G	G	G	L	E	L	G	L	G	L	G	L	G	

# Results

What is the agreement between natural and injection evolution?

	Study Units															
	1 - State		2 - State		3 - Sngltn		4 - Adapt		5 - TM		6 - TM		7 - State		8 - Sngltn	
	Nat	Inj	Nat	Inj	Nat	Inj	Nat	Inj	Nat	Inj	Nat	Inj	Nat	Inj	Nat	Inj
Ana	E	G	L	L	G	L	E	E	L	G	L	L	L	L	G	L
Test	E	L	L	L	L	L	E	L	G	L	G	L	G	L	G	L
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Modif	E	E	E	E	E	E	E	G	G	G	G	G	E	E	G	G
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TDI	E	G	G	G	G	L	E	L	G	L	G	L	G	L	G	L

	Attribute						
	Ana	Test	Modul	Modif	Reuse	TDP	TDI
$\kappa$	0.16	0.0	0.048	0.75	0.091	-0.077	-0.077
Agreement	Slight	None	Slight	Substantial	Slight	None	None

# Results

How does natural and injected evolution compare to experimental results?

	Study Units															
	1 - State		2 - State		3 - Sngltn		4 - Adapt		5 - TM		6 - TM		7 - State		8 - Sngltn	
	Nat	Inj	Nat	Inj	Nat	Inj	Nat	Inj	Nat	Inj	Nat	Inj	Nat	Inj	Nat	Inj
Ana	E	G	L	L	G	L	E	E	L	G	L	L	L	L	G	L
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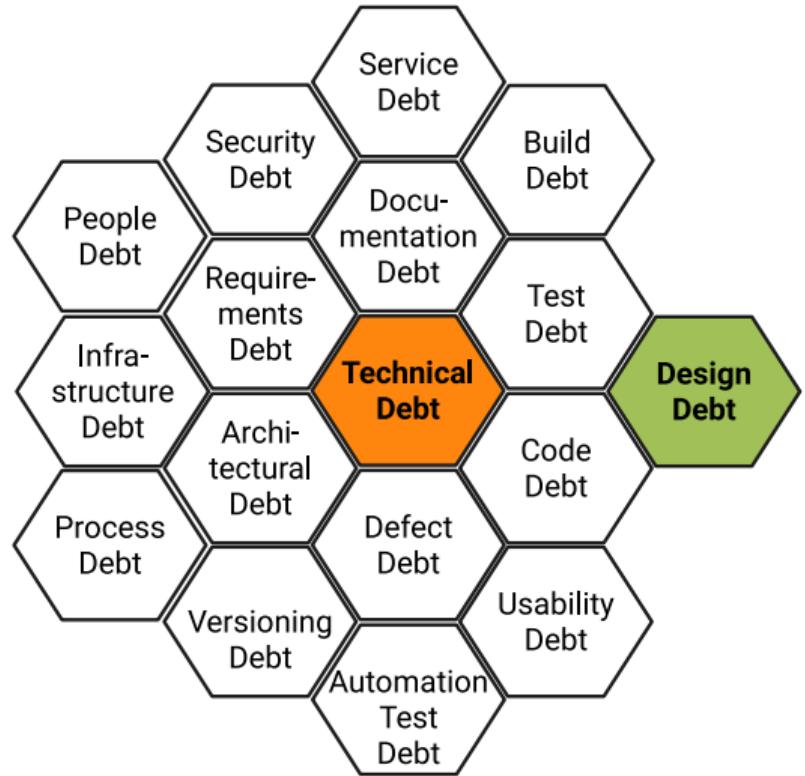
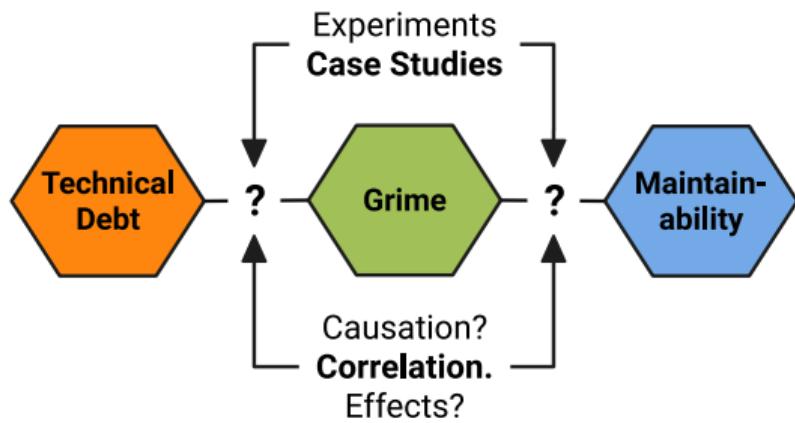
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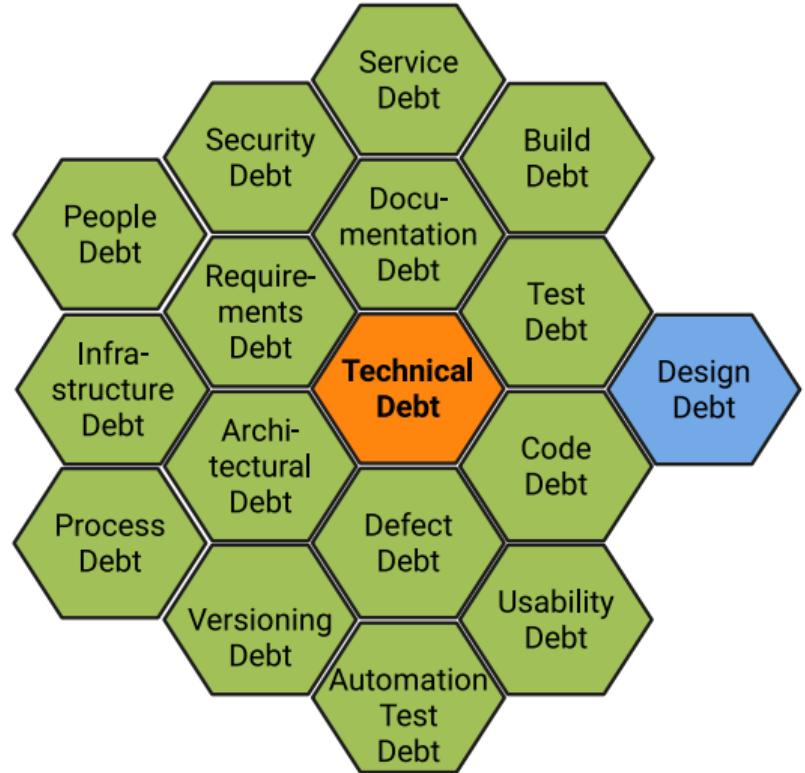
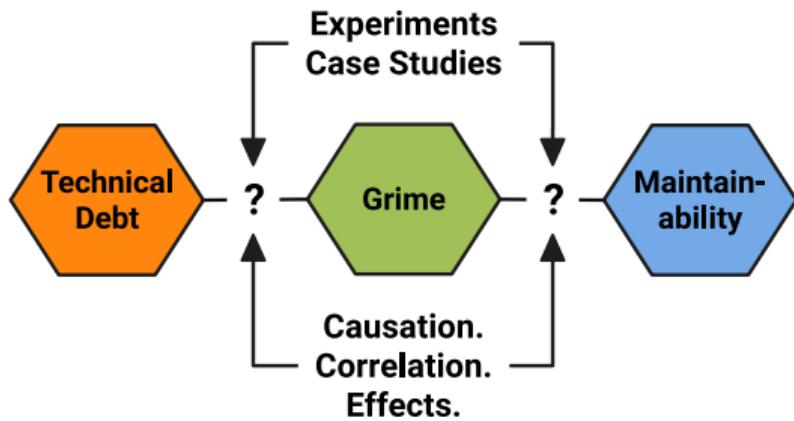
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- 39.583% of the natural evolution results reflect the experimental results
- 52.083% of the injected evolution results reflect the experimental results

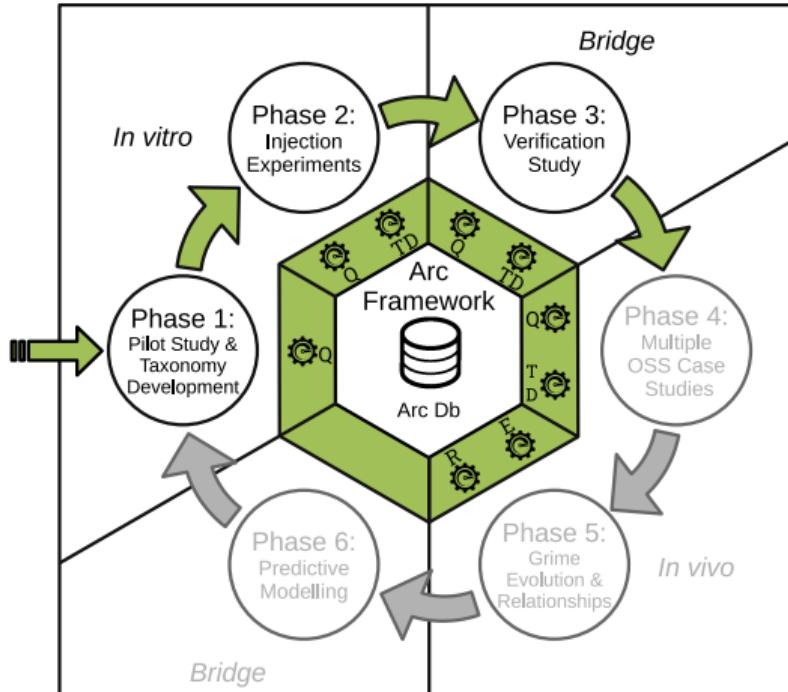
# Impacts



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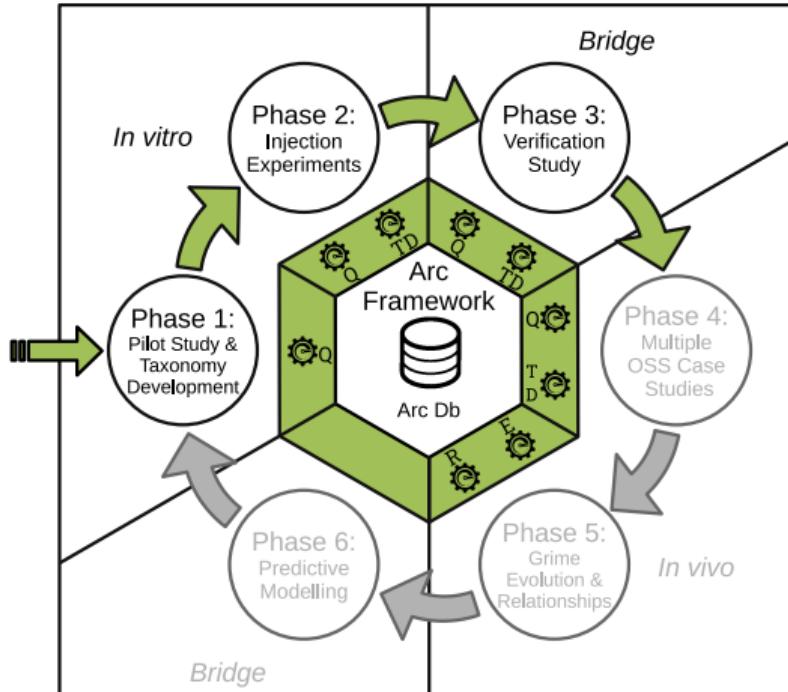
# Impacts



## Researchers:

- Presents a promising approach to explore and understand SE phenomena

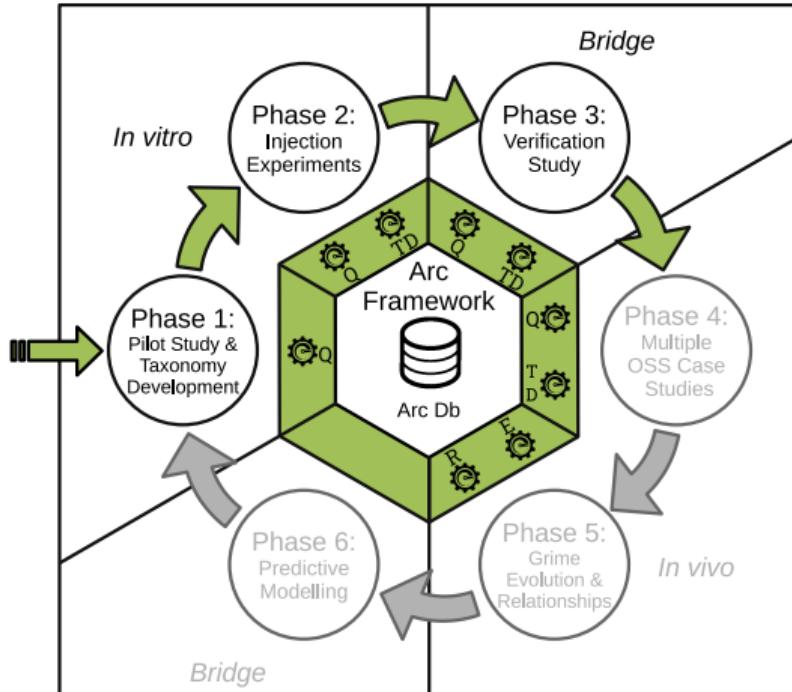
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## Researchers:

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- Bridge the gap between empirical methods allows a combination of results

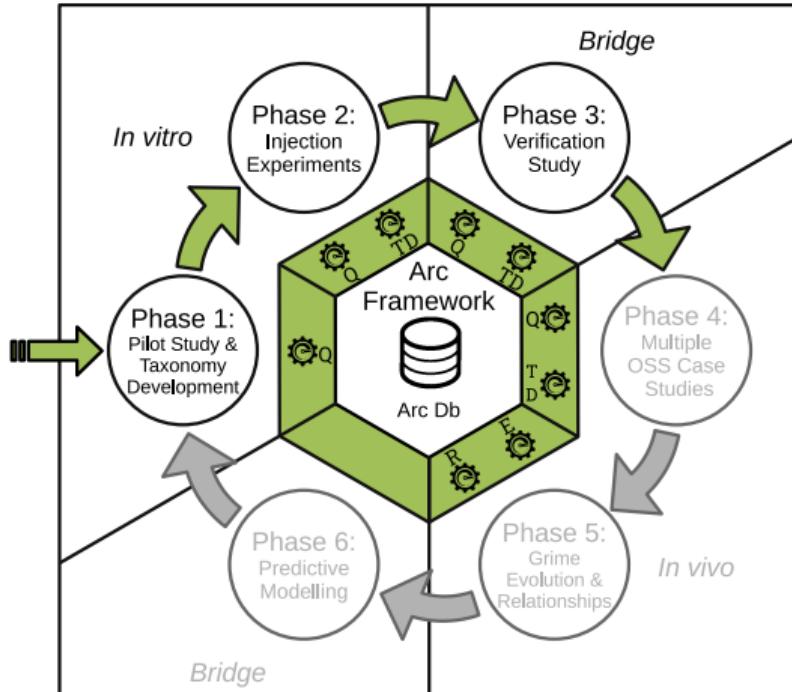
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## Researchers:

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- Confirmed prior results concerning the effects of Modular Grime on Testability and TD Principal

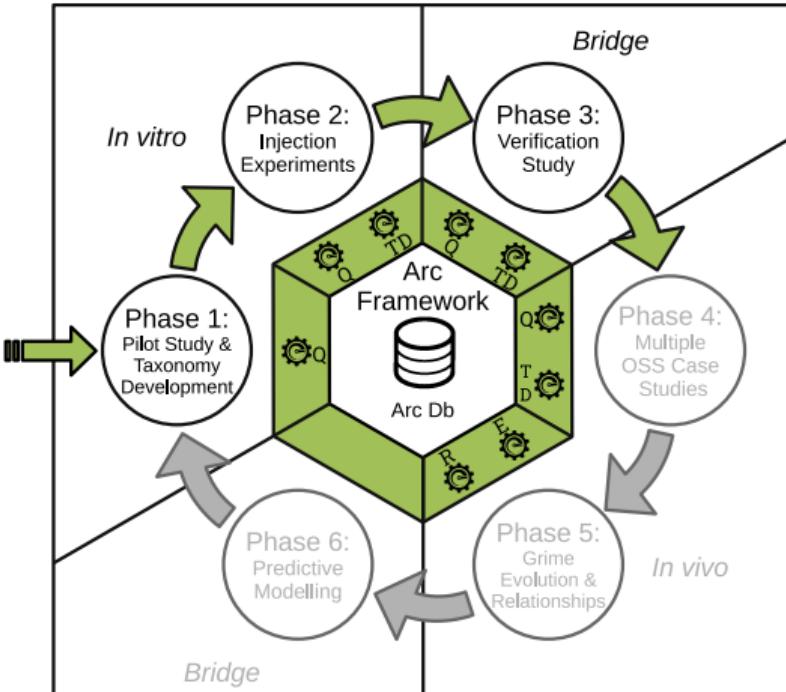
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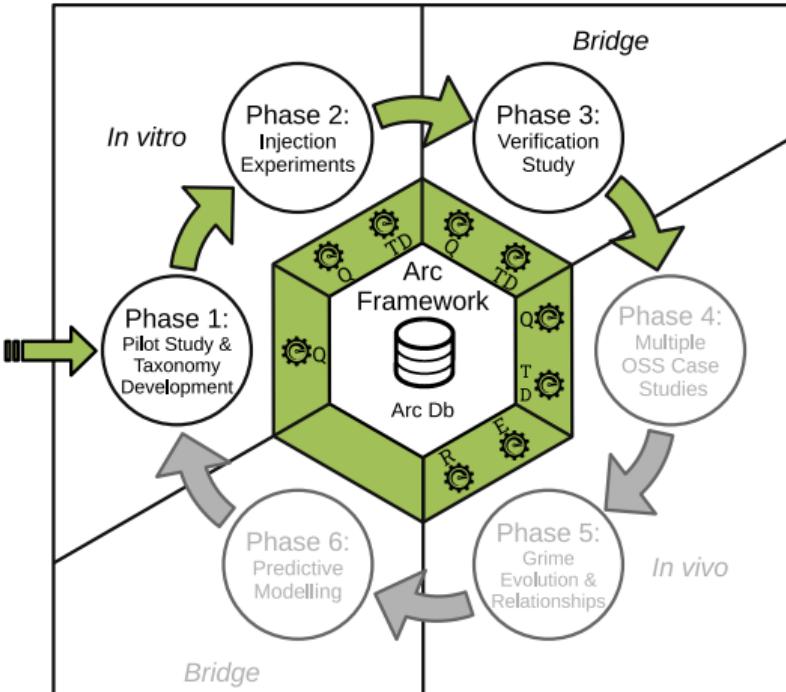
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- Open implementation of the SIG Maintainability Model

# Impacts



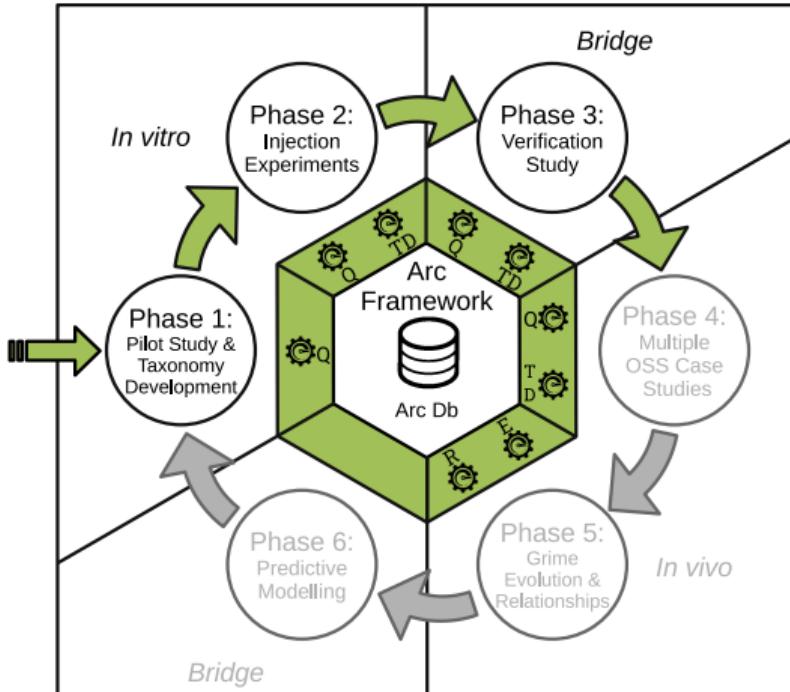
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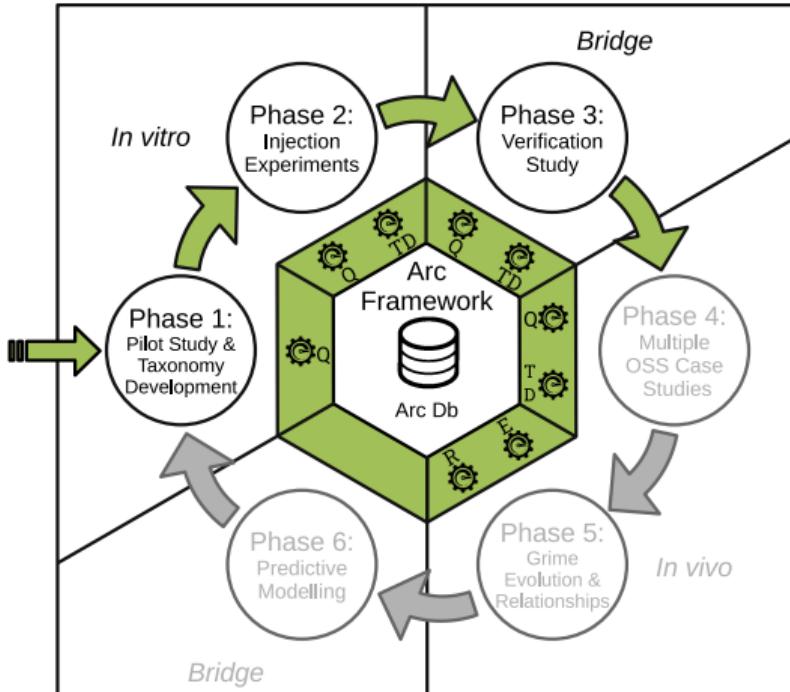
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- **Modifyability:** Specific grime types should be of concern for instances of the Decorator, Observer, Singleton, and Visitor patterns.

# Threats to Validity

## Construct Validity

- Experiments and Validation Study:
  - ▶ Use of modified SIG Maintainability model with linear projection during rating phase.
- Validation Study:
  - ▶ Assumption of accumulative changes in grime between versions

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## External Validity

- Experiments:
  - ▶ Injection used generated rather than real systems
  - ▶ Does not account for Behavioral or Unknown types of grime
  - ▶ Only analyzed the Java language
- Validation Study:
  - ▶ Only Open-Source Java Software Systems
  - ▶ Small sample size
  - ▶ Limited coverage of grime types
  - ▶ Limited coverage of pattern types

# Related Publications

- Manuscript in progress.

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- Technical Debt Measurement Implementation
  - ▶ Griffith I., Reimanis D., Izurieta C., Codabux Z., Deo A., and Williams B., "The Correspondence between Software Quality Models and Technical Debt Estimation Approaches". In Proceedings of the 6th International Workshop on Managing Technical Debt. Victoria, British Columbia, Canada, September 30, 2014.

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- Arc Data Model and Metrics
  - ▶ Griffith I., Wahl S., and Izurieta C., "Evolution of Legacy System Comprehensibility through Automated Refactoring". In Proceedings of IEEE ACM MALETS 2011 International Workshop on Machine Learning Technologies in Software Engineering. In association with the 26th International Conference on Automated Software Engineering, ASE 2011. Lawrence, Kansas, November 7–12, 2011.
  - ▶ Griffith I., Wahl S., and Izurieta C., "TrueRefactor: An Automated Refactoring Tool to Improve Legacy System and Application Comprehensibility". In Proceedings of ISCA 24th International Conference on Computer Applications in Industry and Engineering, CAINE '11. Honolulu, Hawaii, November 2011.

# Future Work

## Short-term:

- Identification and correction of the underlying issues leading to the results of the verification study

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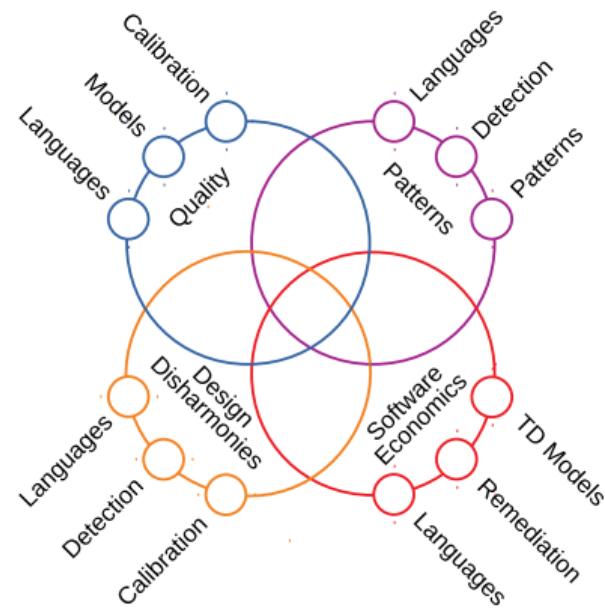
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## Long-term:



# Thank You!

---



## Are there any questions?