Automated Design Smell Detection and Refactoring Pipeline

Overview

These two Python scripts(refactoring_pipeline.py, refactoring_pipe_groq.py) automate the detection and refactoring of design smells in Java code hosted on GitHub. One script leverages Google's Gemini AI, while the other uses Groq AI. Both follow a similar workflow but differ in how they analyze and refactor code.

Features

- Scans Java files in a target directory within a GitHub repository.
- Detects design smells such as God Class, Feature Envy, Long Method, etc.
- Uses Gemini Al or Groq Al for automated analysis and refactoring.
- Creates a new branch and updates files with improved code.
- Generates a pull request (PR) for repository maintainers to review.
- Runs periodically as per cron job settings.

Setup & Requirements

```
# Configuration from environment variables
GEMINI_API_KEY = os.environ["GEMINI_API_KEY"] # Your Gemini API key
GITHUB_TOKEN = os.environ["GITHUB_TOKEN"]
REPO_NAME = os.environ["GITHUB_REPOSITORY"] # e.g.,
"SE-course-serc/project-1-team-9"
TARGET_FOLDER = os.environ.get("TARGET_FOLDER",
"reader-core/src/main/java/com/sismics/reader/core/dao/lucene")
BASE_BRANCH = os.environ.get("BASE_BRANCH", "master")
```

Environment Variables

Ensure the following environment variables are set:

```
export AI_API_KEY="your_gemini_or_groq_api_key"
export GITHUB_TOKEN="your_github_token"
export GITHUB_REPOSITORY="user/repo"
export TARGET_FOLDER="path/to/java/files"
export BASE_BRANCH="master"
```

Install Dependencies

```
pip install google-generativeai groq PyGithub lizard
```

Execution

Run the script manually:

```
python script.py
```

Or schedule it with a cron job for periodic execution:

```
crontab -e
```

Add the following line to run every day at midnight:

```
0 0 * * * /usr/bin/python3 /path/to/script.py
```

Workflow

1. Retrieve Java Files

- o Connects to the specified GitHub repository.
- Fetches Java files from the target directory.
- Uses the GitHub API to read file contents and track changes.

2. Detect Design Smells

- Uses Gemini or Groq AI to analyze code and detect design issues.
- The Gemini script processes two files at a time, analyzing for predefined smells.
- The Groq script includes additional code metrics (lines of code, function count, cyclomatic complexity) for better context.
- If no issues are found, the process stops.

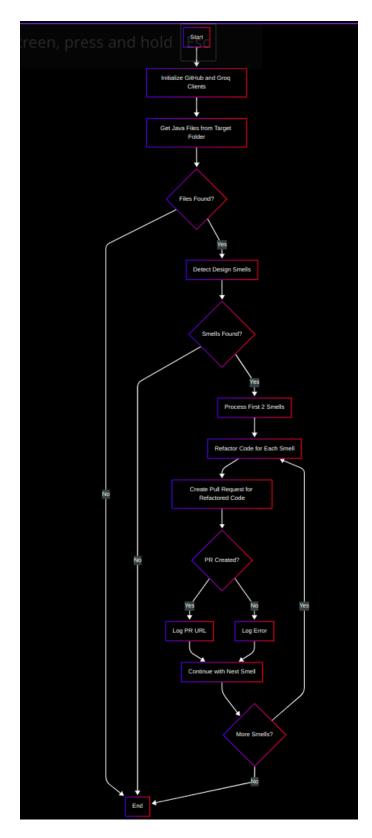
3. Refactor Code

- o Al generates refactored code for each detected issue.
- Ensures improved structure while maintaining functionality.

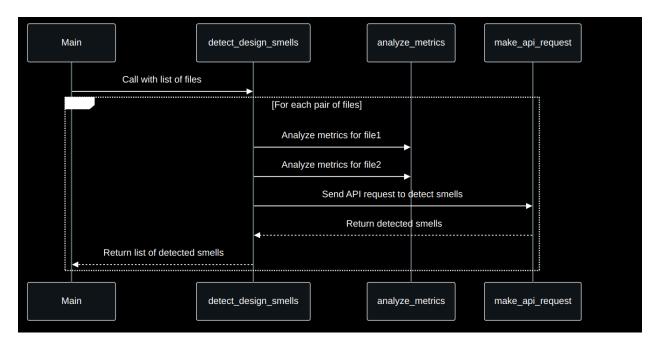
4. Create Pull Request

- o Generates a new branch for refactored changes.
- o Updates affected files in the repository.
- Submits a pull request with a summary of the improvements.

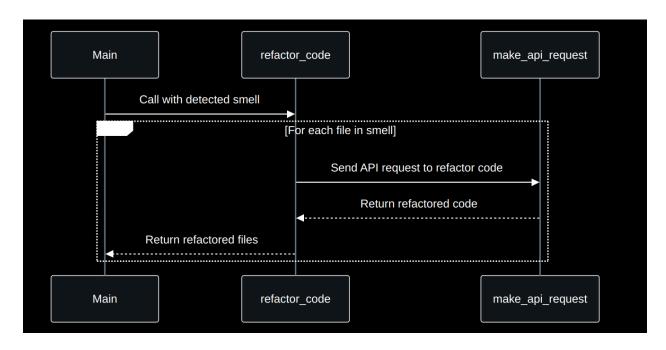
Flowchart of Main Execution Process



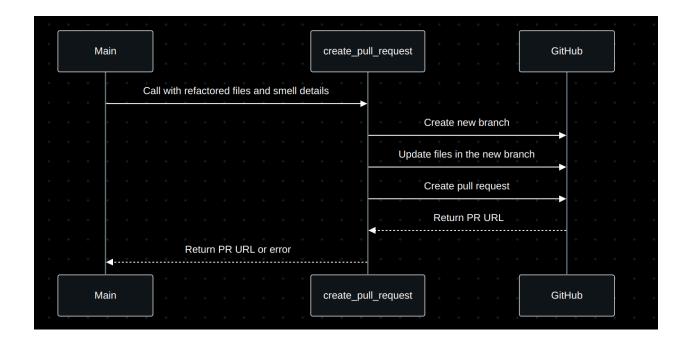
Sequence Diagram for detect_design_smells



Sequence Diagram for refactor_code



Sequence Diagram for create_pull_request

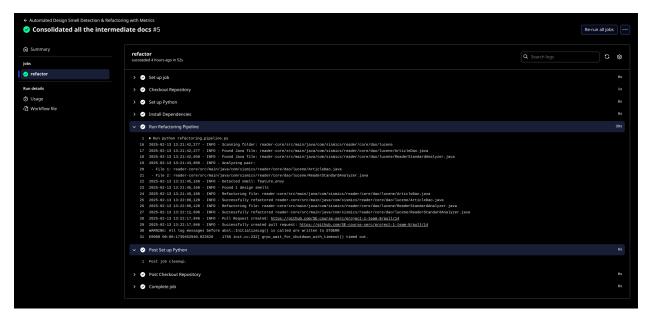


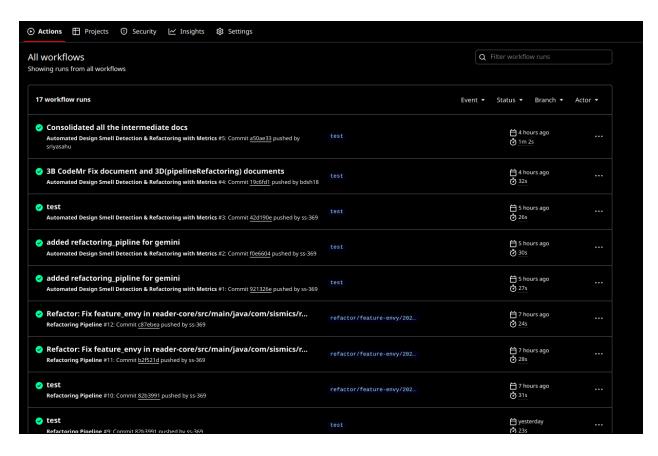
GitHub Actions Workflow

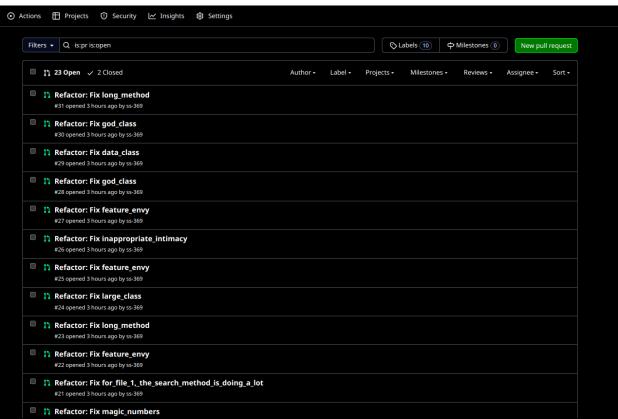
The automation is integrated with GitHub Actions to run on various triggers:

name: Automated Design Smell Detection using Gemini & Refactoring with Metrics

```
- name: Checkout Repository
       uses: actions/checkout@v3
     - name: Set up Python
       uses: actions/setup-python@v4
       with:
         python-version: '3.x'
     - name: Install Dependencies
       run:
         pip install PyGithub google-generativeai lizard
     - name: Run Refactoring Pipeline
       env:
         GEMINI_API_KEY: ${{ secrets.GEMINI_API_KEY }}
         GITHUB_TOKEN: ${{ secrets.GITHUB_TOKEN }}
         GITHUB_REPOSITORY: "SE-course-serc/project-1-team-9"
         TARGET_FOLDER:
"reader-core/src/main/java/com/sismics/reader/core/dao/lucene"
         BASE BRANCH: "master"
       run:
         python refactoring_pipeline.py
```







Key Differences Between Scripts

- Al Service: One script uses Gemini, the other uses Groq.
- Code Metrics: The Groq script incorporates additional code metrics for better Al analysis.
- Retry Logic: The Groq script includes robust retry logic to handle API rate limits.
- Smell Lists: Though similar, the lists of design smells each script detects differ slightly.

Logging & Error Handling

- Logs all key actions and errors.
- Handles API failures and GitHub access issues.
- Implements retry mechanisms for robustness (Groq script only).
- Skips problematic files while continuing with the process.

Sample outputs:

```
2025-02-13 19:45:40,165 - INFO - Scanning folder:
reader-core/src/main/java/com/sismics/reader/core/dao/lucene
2025-02-13 19:45:40,165 - INFO - Found Java file:
reader-core/src/main/java/com/sismics/reader/core/dao/lucene/ArticleDao.java
2025-02-13 19:45:40,762 - INFO - Found Java file:
reader-core/src/main/java/com/sismics/reader/core/dao/lucene/ReaderStandardA
nalyzer.java
2025-02-13 19:45:41,354 - INFO - Analyzing pair:
- File 1:
reader-core/src/main/java/com/sismics/reader/core/dao/lucene/ArticleDao.java
reader-core/src/main/java/com/sismics/reader/core/dao/lucene/ReaderStandardA
nalyzer.java
2025-02-13 19:45:42,061 - INFO - HTTP Request: POST
https://api.groq.com/openai/v1/chat/completions "HTTP/1.1 200 OK"
2025-02-13 19:45:42,074 - INFO - Raw API response: safe
2025-02-13 19:45:42,074 - INFO - Found 0 design smells
(refac) → project-1-team-9 git:(test) X python3 oen.py
2025-02-13 19:49:57,337 - INFO - Scanning folder:
```

```
reader-core/src/main/java/com/sismics/reader/core/dao/lucene
2025-02-13 19:49:57,338 - INFO - Found Java file:
reader-core/src/main/java/com/sismics/reader/core/dao/lucene/ArticleDao.java
2025-02-13 19:49:57,894 - INFO - Found Java file:
reader-core/src/main/java/com/sismics/reader/core/dao/lucene/ReaderStandardA
nalyzer.java
2025-02-13 19:49:58,461 - INFO - Analyzing pair:
reader-core/src/main/java/com/sismics/reader/core/dao/lucene/ArticleDao.java
 - File 2:
reader-core/src/main/java/com/sismics/reader/core/dao/lucene/ReaderStandardA
nalyzer.java
2025-02-13 19:50:01,371 - INFO - HTTP Request: POST
https://api.groq.com/openai/v1/chat/completions "HTTP/1.1 200 OK"
2025-02-13 19:50:01,381 - INFO - Raw API response: god_class: ArticleDao
class has multiple responsibilities such as rebuilding index, creating,
updating, and deleting articles, as well as searching for articles, which
makes it a god class.
long method: The search method in ArticleDao is quite long and complex,
making it hard to understand and maintain.
primitive_obsession: The ArticleDao class uses many primitive types such as
strings and integers, which can make the code harder to understand and
maintain.
magic numbers: The ArticleDao class uses magic numbers such as 100000 and
20, which can make the code harder to understand and maintain.
long parameter_list: The search method in ArticleDao has a long parameter
list, which can make the code harder to understand and maintain.
tight_coupling: The ArticleDao class is tightly coupled with the Lucene
library, which can make it harder to change or replace the library.
data class: The Article class seems to be a data class, as it only has
getter and setter methods, which can make the code less object-oriented.
large class: The ArticleDao class has many methods and fields, which can
make it harder to understand and maintain.
deep_nesting: The search method in ArticleDao has deep nesting, which can
make the code harder to understand and maintain.
complex conditional: The search method in ArticleDao has complex
conditionals, which can make the code harder to understand and maintain.
global_data: The ArticleDao class uses global data such as the AppContext,
which can make the code harder to understand and maintain.
feature envy: The ArticleDao class seems to envy the features of the Lucene
library, as it uses many of its classes and methods directly.
2025-02-13 19:50:01,381 - INFO - Detected smell: god_class
2025-02-13 19:50:01,382 - INFO - Detected smell: long_method
```

```
2025-02-13 19:50:01,382 - INFO - Detected smell: primitive obsession
2025-02-13 19:50:01,382 - INFO - Detected smell: magic_numbers
2025-02-13 19:50:01,382 - INFO - Detected smell: long_parameter_list
2025-02-13 19:50:01,382 - INFO - Detected smell: tight coupling
2025-02-13 19:50:01,382 - INFO - Detected smell: data_class
2025-02-13 19:50:01,383 - INFO - Detected smell: large_class
2025-02-13 19:50:01,383 - INFO - Detected smell: deep nesting
2025-02-13 19:50:01,383 - INFO - Detected smell: complex conditional
2025-02-13 19:50:01,383 - INFO - Detected smell: global data
2025-02-13 19:50:01,384 - INFO - Detected smell: feature_envy
2025-02-13 19:50:01,384 - INFO - Found 12 design smells
2025-02-13 19:50:01,384 - INFO - More than 2 design smells detected.
Processing only the first 2.
2025-02-13 19:50:01,384 - INFO - Refactoring file:
reader-core/src/main/java/com/sismics/reader/core/dao/lucene/ArticleDao.java
2025-02-13 19:50:08,019 - INFO - HTTP Request: POST
https://api.groq.com/openai/v1/chat/completions "HTTP/1.1 200 OK"
2025-02-13 19:50:08,024 - INFO - Successfully refactored
reader-core/src/main/java/com/sismics/reader/core/dao/lucene/ArticleDao.java
2025-02-13 19:50:08,025 - INFO - Refactoring file:
reader-core/src/main/java/com/sismics/reader/core/dao/lucene/ReaderStandardA
nalyzer.java
2025-02-13 19:50:08,306 - INFO - HTTP Request: POST
https://api.groq.com/openai/v1/chat/completions "HTTP/1.1 429 Too Many
Requests"
2025-02-13 19:50:08,308 - INFO - Retrying request to
/openai/v1/chat/completions in 16.000000 seconds
2025-02-13 19:50:29,591 - INFO - HTTP Request: POST
https://api.groq.com/openai/v1/chat/completions "HTTP/1.1 200 OK"
2025-02-13 19:50:29,592 - INFO - Successfully refactored
reader-core/src/main/java/com/sismics/reader/core/dao/lucene/ReaderStandardA
nalyzer.java
2025-02-13 19:50:36,082 - INFO - Pull Request created:
https://github.com/SE-course-serc/project-1-team-9/pull/30
2025-02-13 19:50:36,082 - INFO - Successfully created pull request:
https://github.com/SE-course-serc/project-1-team-9/pull/30
2025-02-13 19:50:36,082 - INFO - Refactoring file:
reader-core/src/main/java/com/sismics/reader/core/dao/lucene/ArticleDao.java
2025-02-13 19:50:36,463 - INFO - HTTP Request: POST
https://api.groq.com/openai/v1/chat/completions "HTTP/1.1 429 Too Many
Requests"
2025-02-13 19:50:36,464 - INFO - Retrying request to
/openai/v1/chat/completions in 20.000000 seconds
```

```
2025-02-13 19:51:03,907 - INFO - HTTP Request: POST
https://api.groq.com/openai/v1/chat/completions "HTTP/1.1 200 OK"
2025-02-13 19:51:03,914 - INFO - Successfully refactored
reader-core/src/main/java/com/sismics/reader/core/dao/lucene/ArticleDao.java
2025-02-13 19:51:03,914 - INFO - Refactoring file:
reader-core/src/main/java/com/sismics/reader/core/dao/lucene/ReaderStandardA
nalyzer.java
2025-02-13 19:51:04,198 - INFO - HTTP Request: POST
https://api.groq.com/openai/v1/chat/completions "HTTP/1.1 429 Too Many
Requests"
2025-02-13 19:51:04,198 - INFO - Retrying request to
/openai/v1/chat/completions in 21.000000 seconds
2025-02-13 19:51:28,453 - INFO - HTTP Request: POST
https://api.groq.com/openai/v1/chat/completions "HTTP/1.1 200 OK"
2025-02-13 19:51:28,456 - INFO - Successfully refactored
reader-core/src/main/java/com/sismics/reader/core/dao/lucene/ReaderStandardA
nalyzer.java
2025-02-13 19:51:35,085 - INFO - Pull Request created:
https://github.com/SE-course-serc/project-1-team-9/pull/31
2025-02-13 19:51:35,085 - INFO - Successfully created pull request:
https://github.com/SE-course-serc/project-1-team-9/pull/31
```

```
(refac) → project-1-team-9 git:(test) X python3 refactoring pipeline.py
2025-02-13 19:37:12,661 - INFO - Scanning folder:
reader-core/src/main/java/com/sismics/reader/core/dao/lucene
2025-02-13 19:37:12,661 - INFO - Found Java file:
reader-core/src/main/java/com/sismics/reader/core/dao/lucene/ArticleDao.java
2025-02-13 19:37:13,243 - INFO - Found Java file:
reader-core/src/main/java/com/sismics/reader/core/dao/lucene/ReaderStandardAn
alyzer.java
2025-02-13 19:37:13,821 - INFO - Analyzing pair:
- File 1:
reader-core/src/main/java/com/sismics/reader/core/dao/lucene/ArticleDao.java
reader-core/src/main/java/com/sismics/reader/core/dao/lucene/ReaderStandardAn
alvzer.java
2025-02-13 19:37:21,775 - INFO - Detected smell: data_class
2025-02-13 19:37:21,776 - INFO - Found 1 design smells
2025-02-13 19:37:21,776 - INFO - Refactoring file:
reader-core/src/main/java/com/sismics/reader/core/dao/lucene/ArticleDao.java
2025-02-13 19:38:13,284 - INFO - Successfully refactored
reader-core/src/main/java/com/sismics/reader/core/dao/lucene/ArticleDao.java
```

```
2025-02-13 19:38:13,285 - INFO - Refactoring file:
reader-core/src/main/java/com/sismics/reader/core/dao/lucene/ReaderStandardAn
alyzer.java
2025-02-13 19:38:41,747 - INFO - Successfully refactored
reader-core/src/main/java/com/sismics/reader/core/dao/lucene/ReaderStandardAn
alyzer.java
2025-02-13 19:38:48,258 - INFO - Pull Request created:
https://github.com/SE-course-serc/project-1-team-9/pull/29
2025-02-13 19:38:48,259 - INFO - Successfully created pull request:
https://github.com/SE-course-serc/project-1-team-9/pull/29
```

Conclusion

These scripts automate the detection and refactoring of design smells in Java code using AI, ensuring better maintainability and code quality in repositories. Maintain and update the scripts as needed to enhance detection capabilities or update AI models.