



# SUMMER RESEARCH INTERSHIP PRESENTATION

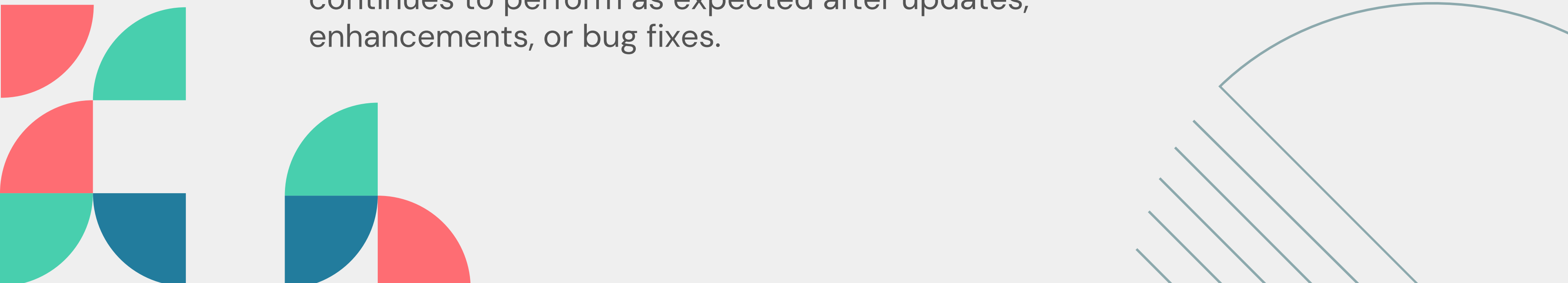
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202103048



# **"REGRESSION TEST CASE GENERATION USING PRE-TRAINED LARGE LANGUAGE MODELS"**



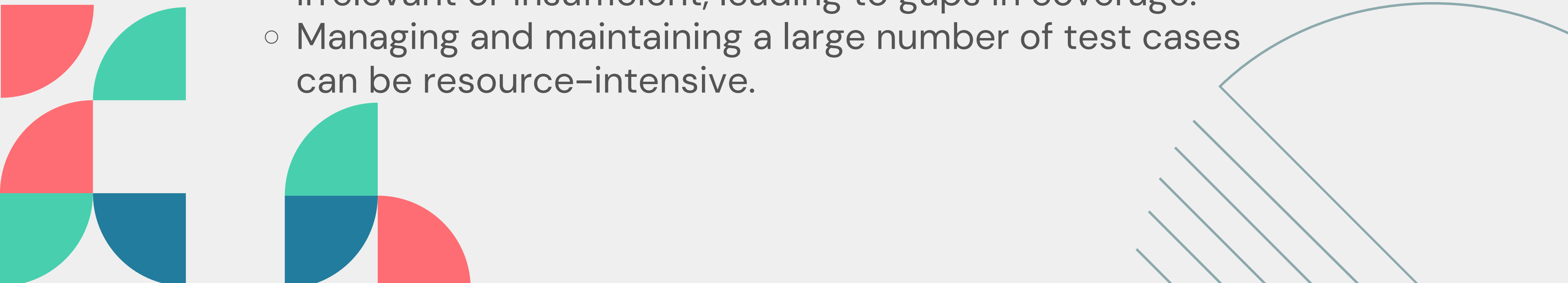
# PROJECT INTRODUCTION

- Regression Test Case Generation refers to the process of creating and updating test cases specifically designed to ensure that new changes in a software application do not break or adversely affect existing functionality.
  - The goal of regression testing is to verify that the software continues to perform as expected after updates, enhancements, or bug fixes.
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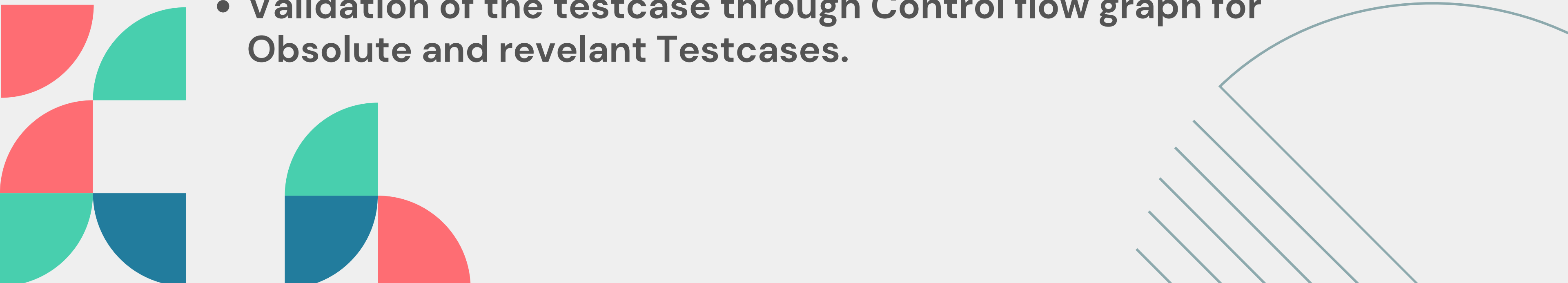
# PROJECT INTRODUCTION

- **Challenges:**

- Manual test case generation is time-consuming and prone to human error.
  - Automated tools may generate test cases that are irrelevant or insufficient, leading to gaps in coverage.
  - Managing and maintaining a large number of test cases can be resource-intensive.
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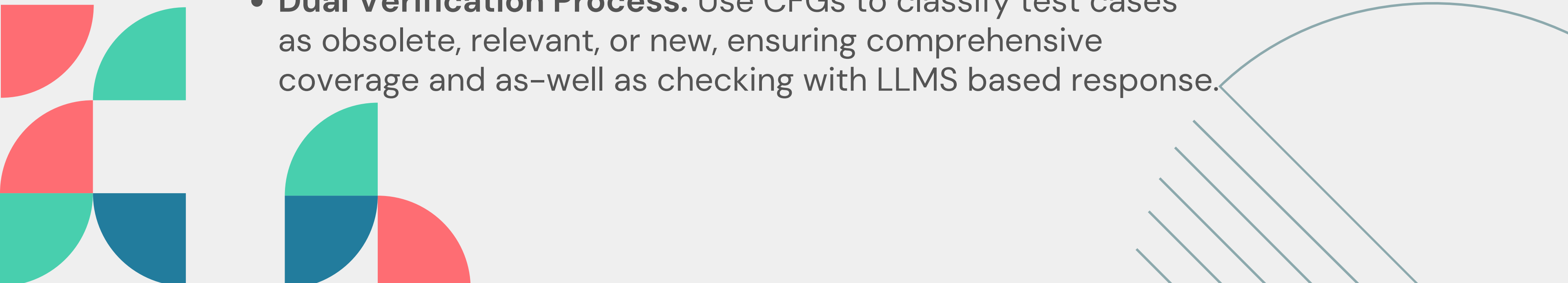
# PROJECT OBJECTIVE

- Develop a concise Prompting Technique for better Testcase generation.
  - Using Structural Comparison of Control Flow graphs to differentiate between the different paths and branches of given code.
  - Validation of the testcase through Control flow graph for Absolute and relevant Testcases.
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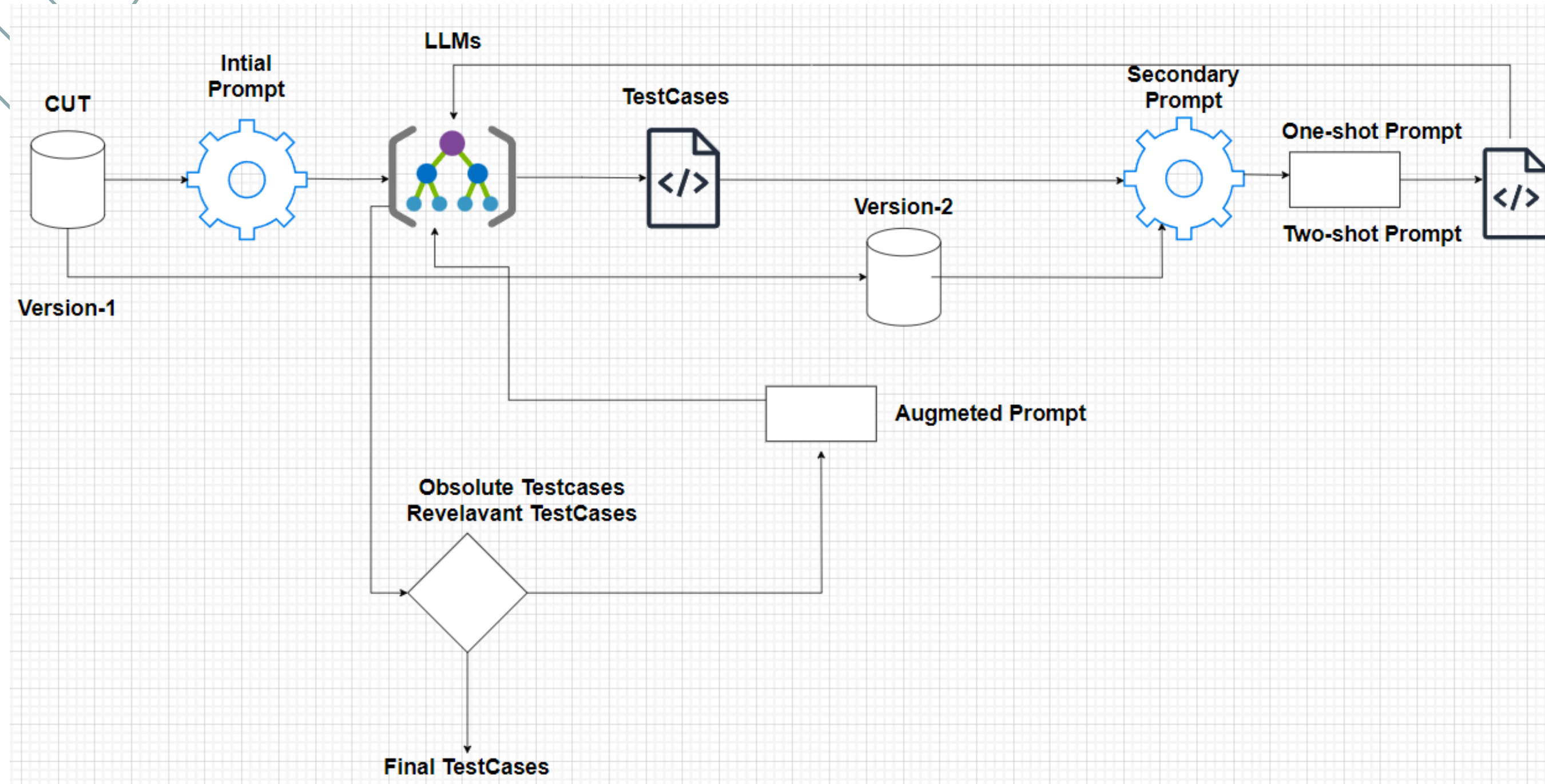


# PROPOSED APPROACH

## Combining LLMs and CFGs

- **LLMs (Gemini):** Automatically generate diverse and relevant test cases targeting new and modified code paths.
  - **CFGs:** Analyze the structure of the code to identify critical paths and verify the relevance of generated test cases.
  - **Develop Concise Prompt** for LLMs for Testcase generation for better Coverage.
  - **Dual Verification Process:** Use CFGs to classify test cases as obsolete, relevant, or new, ensuring comprehensive coverage and as-well as checking with LLMS based response.
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# FLOWCHART REPRESENTATION



# TERMINOLOGY

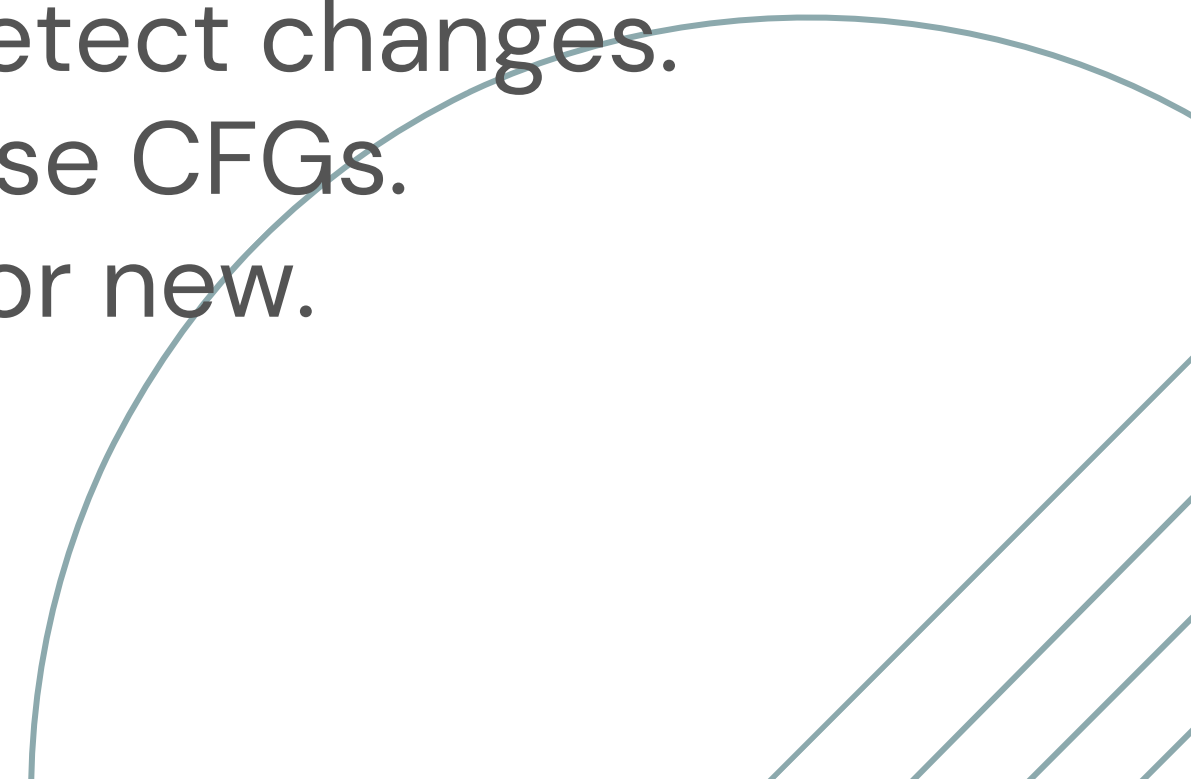
- **Obsolete test cases** are those that are no longer applicable or relevant because the parts of the code they were designed to test have been removed.
- **Relevant test cases** are those that remain valid and useful after code changes. They continue to correctly test the functionality of the software, including both unchanged and newly added code paths.





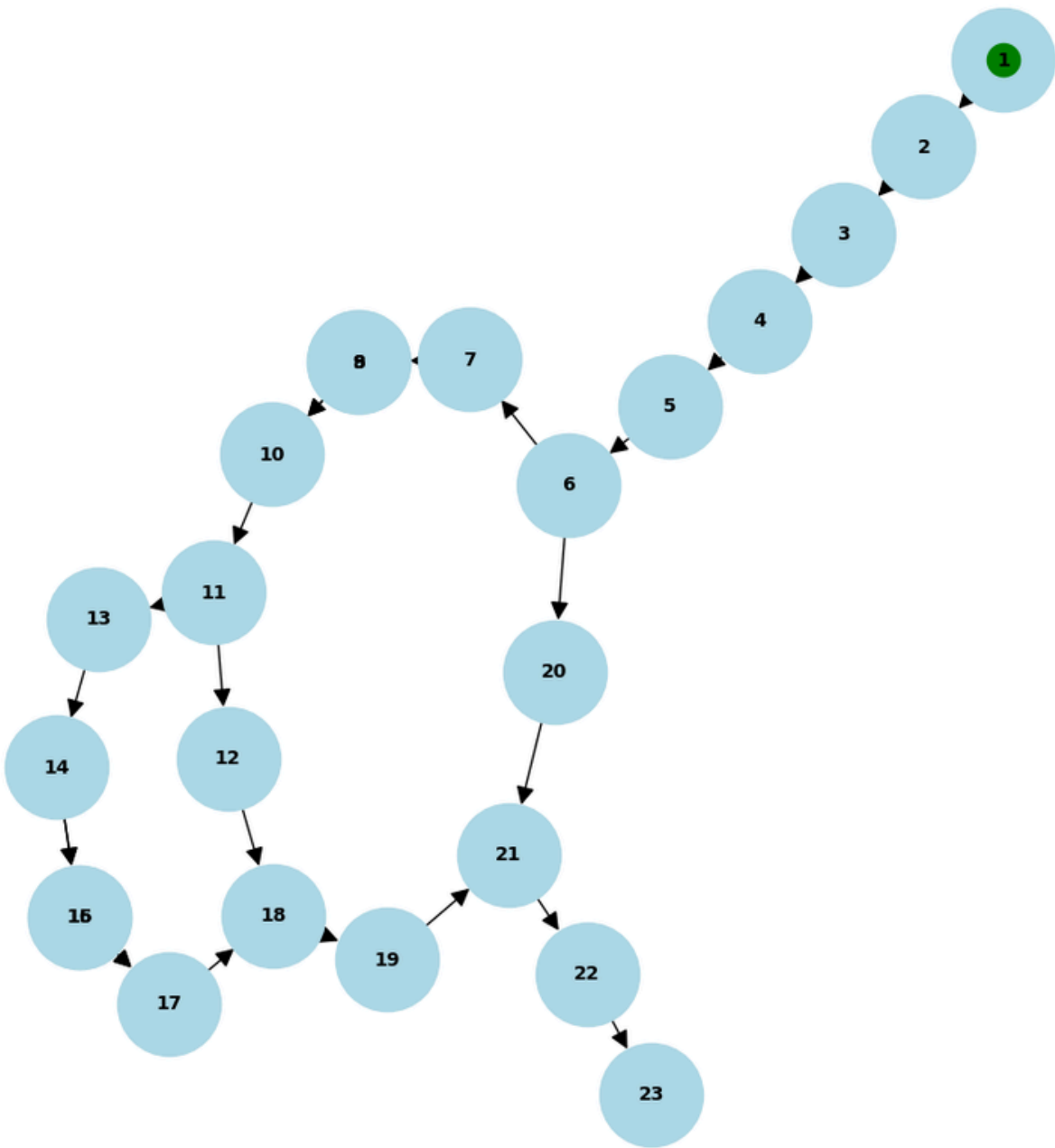
# ROLE OF CONTROL FLOW GRAPH

## Verification with CFGs of generated testcases

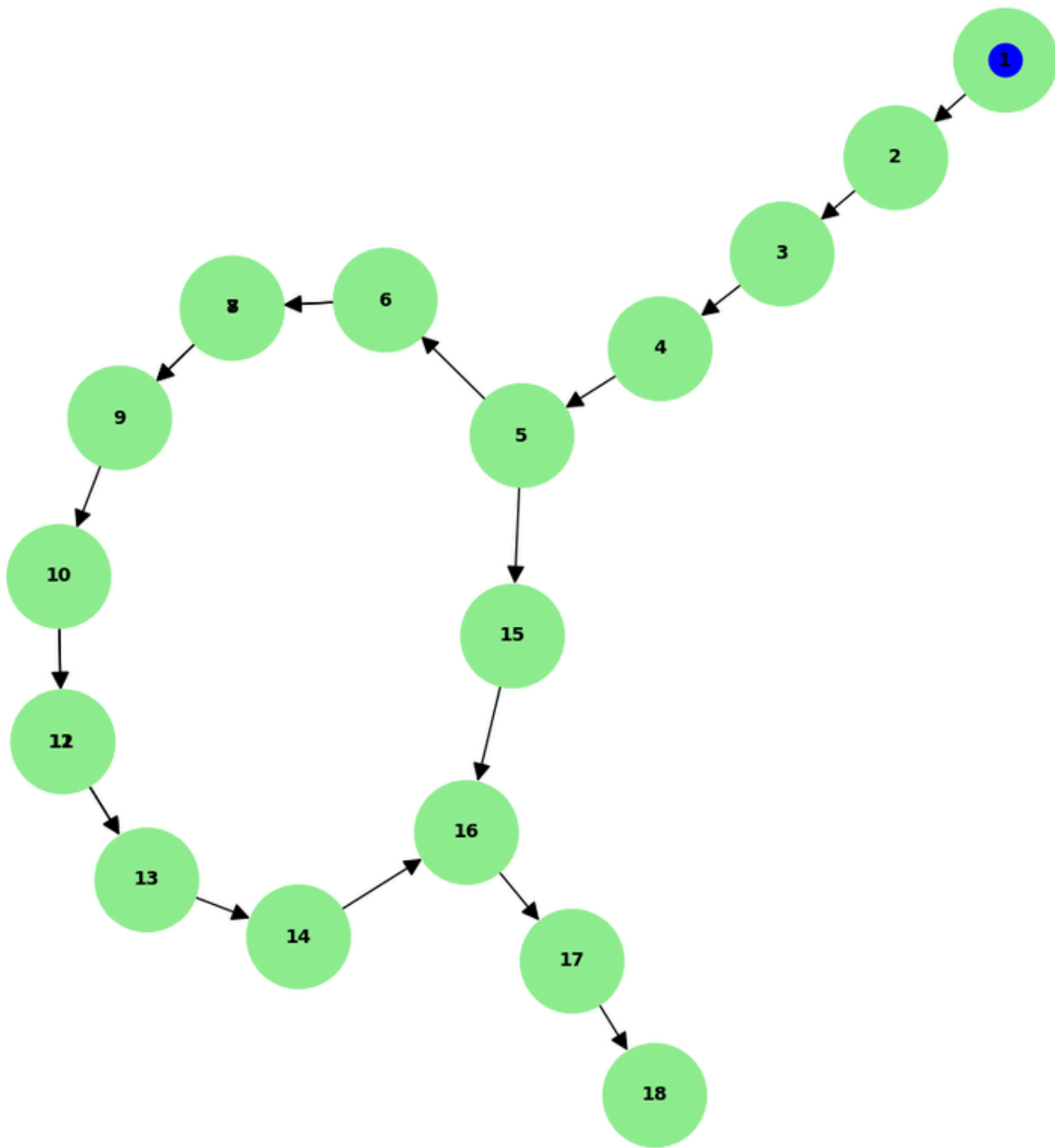
- Generate CFGs for both the original and modified code versions.
  - Represent code blocks and control flow between them.
  - Identify all possible execution paths within the code.
  - Compare original and modified CFGs to detect changes.
  - Map generated test cases to paths in these CFGs.
  - Classify test cases as obsolete, relevant, or new.
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# DEMONSTRATION

CFG for Version 1 (Corrected)



CFG for Version 2 (Corrected)



# DEMONSTRATION

Node Number to Syntax Mapping:

```
1: Equilateral = 0
2: Isosceles = 1
3: Scalene = 2
4: Right_Triangle = 3
5: entry
6: if a < b + c and b < a + c and (c < a + b)
7: if a ** 2 + b ** 2 == c ** 2 or b ** 2 + c ** 2 == a ** 2 or c ** 2 + a ** 2 ==
8: return Right_Triangle
9: else
10: join
11: if a == b == c
12: return Equilateral
13: else
14: if a == b or b == c or a == c
15: return Isosceles
16: else
17: join
18: join
19: return Scalene
20: else
21: join
22: return None
23: exit
```

Node Number to Syntax Mapping:

```
1: Equilateral = 0
2: Scalene = 1
3: Right_Triangle = 2
4: entry
5: if a < b + c and b < a + c and (c < a + b)
6: if a ** 2 + b ** 2 == c ** 2 or b ** 2 + c ** 2 == a ** 2 or c ** 2 + a ** 2 ==
7: return Right_Triangle
8: else
9: join
10: if a == b == c
11: return Equilateral
12: else
13: join
14: return Scalene
15: else
16: join
17: return None
18: exit
```

Number of independent paths for Version 1 (Corrected): 5

Number of independent paths for Version 2 (Corrected): 4

# DEMONSTRATION

## Original Version

```
regression_program_code_1 = """
Equilateral = 0
Isosceles = 1
Scalene = 2
Right_Triangle=3

def triangle_type(a, b, c):
    if a < b + c and b < a + c and c < a + b:
        if a**2 + b**2 == c**2 or b**2 + c**2 == a**2 or c**2 + a**2 == b**2:
            return Right_Triangle
        if a == b == c:
            return Equilateral
        elif a == b or b == c or a == c:
            return Isosceles
        return Scalene
    return None
"""
```

## Modified Version

```
regression_program_code_2 = """
Equilateral = 0
Scalene = 1
Right_Triangle=2

def triangle_type(a, b, c):
    if a < b + c and b < a + c and c < a + b:
        if a**2 + b**2 == c**2 or b**2 + c**2 == a**2 or c**2 + a**2 == b**2:
            return Right_Triangle
        if a == b == c:
            return Equilateral
        return Scalene
    return None
"""
```

# DEMONSTRATION

## Original Version's Testcase by LLM

```
self.assertEqual(triangle_type(5, 5, 5), Equilateral),
self.assertEqual(triangle_type(5, 5, 3), Isosceles),
self.assertEqual(triangle_type(3, 4, 5), Scalene),
self.assertEqual(triangle_type(3, 4, 5), Right_Triangle),
self.assertIsNone(triangle_type(1, 2, 5)),
self.assertIsNone(triangle_type(0, 3, 4)),
self.assertIsNone(triangle_type(-1, 3, 4)),
self.assertEqual(triangle_type(3.0, 4.0, 5.0), Right_Triangle),
self.assertEqual(triangle_type(1000, 1000, 1000), Equilateral),
self.assertEqual(triangle_type(0.1, 0.1, 0.1), Equilateral),
self.assertEqual(triangle_type(5, 3, 5), Isosceles),
self.assertEqual(triangle_type(5, 4, 3), Right_Triangle)
```

## Modified Version Testcase by LLM

```
self.assertEqual(triangle_type(5, 5, 5), Equilateral)
self.assertEqual(triangle_type(3, 4, 5), Scalene)
self.assertEqual(triangle_type(3, 4, 5), Right_Triangle)
self.assertIsNone(triangle_type(1, 2, 5))
self.assertIsNone(triangle_type(0, 3, 4))
self.assertIsNone(triangle_type(-1, 3, 4))
self.assertEqual(triangle_type(3.0, 4.0, 5.0), Right_Triangle)
self.assertEqual(triangle_type(1000, 1000, 1000), Equilateral)
self.assertEqual(triangle_type(0.1, 0.1, 0.1), Equilateral)
self.assertEqual(triangle_type(5, 5, 3), Scalene) # Isosceles but not
self.assertEqual(triangle_type(5, 3, 5), Scalene) # Isosceles but not
self.assertEqual(triangle_type(5, 4, 3), Right_Triangle)
```

# DEMONSTRATION

## Two shot prompting

```
# Here is the Regression function:
{regression_program_code_1} and {regression_program_code_2}

# Task -1 : Understand the Context before Generating the test cases. :
  Obsolete Test Cases: The Testcase which are not getting affected because of change in code.
  New Testcase : The Testcase which introduced by the updated version of the function.
  Regression Test Cases: The Testcase which include the new test cases that cover the updated functionality, as well as the existing test cases that are not obsolete.

# Task 2 - check by passing testcase in function whether the following testcase passes all the conditions and expected value and actual value are same or not.
# Task 3 - identify the obsolete test cases that are not getting affected because of change.
# Task 4 - identify the Relevant test cases.
# Task 5- = Now generate new test cases according to modified version and check manually too in detail calculation and also append to original passed testcases if it passed manually in task -1.
# mention under **Complete Set of Test Cases:**
# Note : format of testcase should be assert function_name(parameters)..
"""
```

### ## Task 3: Obsolete Test Cases

```
* `self.assertEqual(triangle_type(5, 5, 3), Isosceles)`
* `self.assertEqual(triangle_type(5, 3, 5), Isosceles)`
```

### ## Task 4: Relevant Test Cases

```
* `self.assertEqual(triangle_type(5, 5, 5), Equilateral)`
* `self.assertEqual(triangle_type(3, 4, 5), Scalene)`
* `self.assertEqual(triangle_type(3, 4, 5), Right_Triangle)`
* `self.assertIsNone(triangle_type(1, 2, 5))`
* `self.assertIsNone(triangle_type(0, 3, 4))`
* `self.assertIsNone(triangle_type(-1, 3, 4))`
* `self.assertEqual(triangle_type(3.0, 4.0, 5.0), Right_Triangle)`
* `self.assertEqual(triangle_type(1000, 1000, 1000), Equilateral)`
* `self.assertEqual(triangle_type(0.1, 0.1, 0.1), Equilateral)`
* `self.assertEqual(triangle_type(5, 4, 3), Right_Triangle)`
```

# DEMONSTRATION

## Finding Obsolute and Revelant using CFGs

```
# Find obsolete test cases
obsolete_cases = []
for case in test_cases:
    if path_map_v1[case] != path_map_v2[case]:
        obsolete_cases.append(case)
```

obsolete\_cases

```
[(5, 5, 3), (5, 3, 5)]
```

```
# Compare paths
Relavant_cases = []
for case in test_cases:
    if path_map_v1[case] == path_map_v2[case]:
        Relavant_cases.append(case)

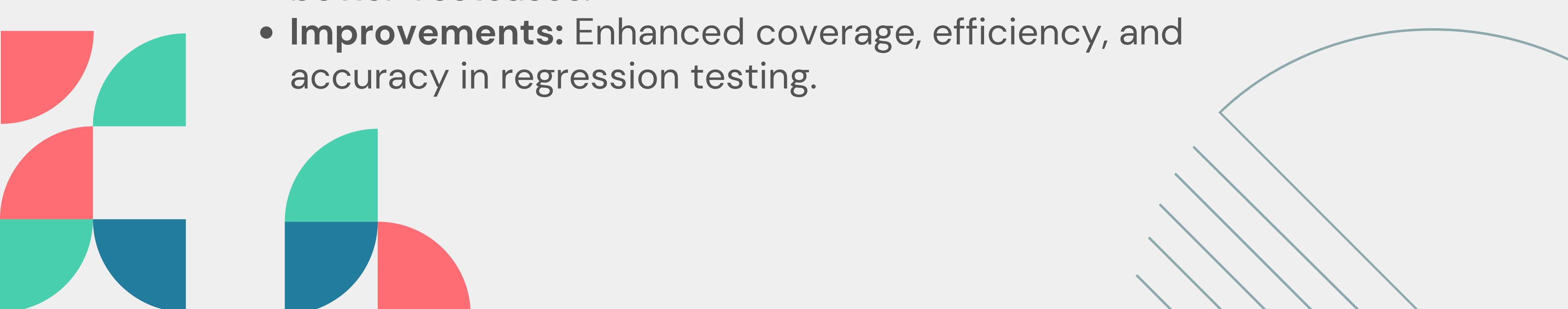
print("Relavant test cases:")
for case in Relavant_cases:
    print(case)
```

Relavant test cases:

```
(5, 5, 5)
(3, 4, 5)
(3, 4, 5)
(1, 2, 5)
(0, 3, 4)
(-1, 3, 4)
(3.0, 4.0, 5.0)
(1000, 1000, 1000)
(0.1, 0.1, 0.1)
(5, 4, 3)
```



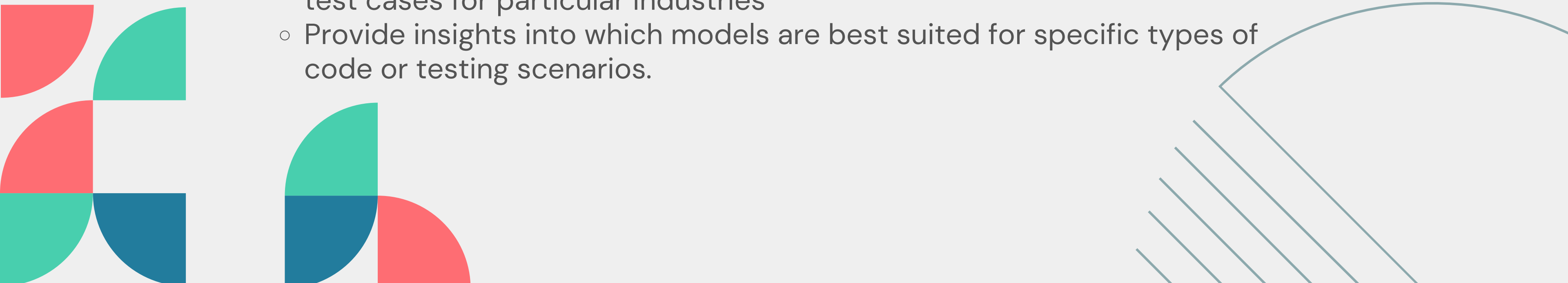
# CONCLUSION AND FUTURE WORK

- **Effective Integration:** LLMs and CFGs together provide a robust framework for regression test case generation.
  - Leveraging the **potential of LLMs** and Concise prompts for better Testcases.
  - **Improvements:** Enhanced coverage, efficiency, and accuracy in regression testing.
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# FUTURE WORK

- **Future Directions:**
    - **Scalability:** Extend the approach to handle larger and more complex codebases.
    - **Advanced Techniques:** Explore integration with dynamic analysis and more sophisticated LLM models for further improvement.
    - Extend the study to compare the performance of different LLMs (e.g., **GPT-4, BERT, T5**) in generating test cases and fine tune LLMs on domain-specific codebases to improve the relevance and accuracy of generated test cases for particular industries
    - Provide insights into which models are best suited for specific types of code or testing scenarios.
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# THANK YOU

<https://colab.research.google.com/drive/19HoNcfckq2vcKBdp6zcWWSZnwrldINc40?usp=sharing>

