### Hierarchical analysis of loops with relaxed abstract transformers

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Circulation is an indispensable component of the program's completion of complex functions. Circulation analysis is a difficult problem in the field of program analysis. The main reason is that it is difficult to find a sufficiently accurate loop invariant to describe the behavior of the loop, especially when the loop exists. The situation becomes more complicated when linear invariants are used.

Index Terms—Loop analysis, Abstract Interpretation, Non-linear invariant, Hierarchical analysis, Relax transformer, Formal Method

#### I. INTRODUCTION

HEstatic analysis technique based on Abstract Interpretation (AI) does not execute the program dynamically, but analyzes its source code statically, and obtains the semantics automatically, thereby verifying the correctness of the program or finding possible errors. Abstract interpretation uses the abstract semantics to approximate the concrete semantics of the program, so it can obtain an approximation of programs reachable states at any program points in a limited time and space. This approximation may contain behaviors that do not exist in the original program, so it may generate false positives. Improving the accuracy to reduce the false alarms is one of the major challenges faced by AI in practical applications. The main precision loss of AI comes from the following two aspects: Firstly, the expressiveness of specified abstract domain limits the precision of AI, such as numerical abstract domain Intervel (x=[a,b]), Octagon (....), Polyhedron (....) that commonly used can only express a linear convex space, and cannot described for nonlinear or non-convex spaces accurately. Secondly, the widening is usually introduced to speed and ensure the convergence of the iterative loop analysis, which aggressively increases the abstracted feasible program states at the loop head, and leads to precision losing heavily. In particular, using a linear abstraction domain to analyze a program with non-linear loop invariants can easily widen the values of variables to infinite boundaries, thereby introducing a large number of false alarms of run-time errors.

Figure 1 a motivating example Consider the motivating program in Fiagure 1(a), which computes the sum of all integers from -9 to 21 through a loop and stores the result in variable y. As a concrete execution of this program, the values of x and y at the program point 1 always satisfy the quadratic equation y = (x-9) \* (x + 10)/2, where -10 = x = 20, that is the parabolic segment (L) in Figure 1 (b). From this quadratic relation, it is not difficult to conclude that the value of y always satisfies -45 = y = 165, so there is no integer overflow after executing the statement y = y + x at program

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point 2. However, the analysis using standard AI with linear abstract domain (including interval, octagon or polyhedron abstract domain, etc.) and normal widening operator can only generate meaningless invariant about variable y at program point 1, that is ? belongs to [-oo,+oo], then the analysis concludes there is an integer overflow error at point 2. And this is obviously a false alarm. In order to eliminate these alarms from non-linear programs, many work designed specific nonlinear abstract domains. However, such domains usually have high time and space complexity and are not universal for all the non-linear features of programs. And most of them can only deal with polynomial invariants with a use-provided degree. For example, the work in [][] can generate the most precise invariants of our motivating example with degree 2, but if we modify the statement Y = Y + X; to Y = Y + X \* X \* X;, these work will not be able to express these polynomial invariants with higher degree. And the constraints of y during the analysis will be lost after widening, then still generate integer overflow false alarms.

We proposes a new hierarchical method for loop analysis. The main idea of our method is using calculated partial invariants (only involving partial program variables) of loop to relax the transfer functions of program, then we take another analysis on relaxed program with more variables but little instability factor during widening. As a result, we can obtain more accurate loop invariant of all program variables in limited iterations of analysis. Firstly, this paper proposes and constructs a variable hierarchy graph based on variable dependencies of loop, and then builds a sliced program sequence (SPS) based on the variable hierarchy graph. Then, we get loop invariants of lower-level variables (called partial invariants) by analyzing the sliced program only involving lower-variables. Next, we use these partial invariants to relax the transfer function of the successor program involving higher-variables from SPS, in order to reach a more accurate fix-point on relaxed program by static analysis based on AI with normal widening. Then, on this basis of transformer relaxing, we also proposes a fix-point solving technology called Formula Method on single variable assignment with interval coefficient to improving the analysis of programs with exponential loop.

Finally, we introduce our framework combining hierarchical loop analysis and transformer relaxing, and implement a prototype tool. The preliminary experimental results show that our method can obtain more accurate invariants.

For our motivating example, our method can generate a linear invariants about x and y expressed by polyhedron abstract domain at the loop header  $x_i=20$ ,  $-x_i=10$ ;  $-9x-y_i=90$ ; -21x+y;=210. Geometrically, the state space represented by our invariants is shown in the gray triangle region in Figure 1(b), i.e. the hyper plane consisting of lines L'(-9x-y;=90), L"  $(-21x+y_1=210)$ , and L"  $(x_1=20)$ . From Figure 1(b), we can see that although the linear abstract domain polyhedron cannot accurately express the quadratic invariants of the original program (i.e. the geometric parabola), our method can use an linear polyhedron invariants to enclose the nonlinear invariants soundly. Come back to check whether the statement y=y+x; can cause an integer overflow, as we can get the range of x is [-9,21] and y is [-270,630] from our linear invariants above at program point 2, we can prove that there is no integer overflow after executing y=y+x;. At this point check the statement y=y+x again; if it causes an integer overflow, we can know from the linear constraint above that the range of x at program point 2 is [-9,21] and the range of y is [-270,630], so that we can prove The statement y = y + x; will not produce integer overflow, i.e. we have eliminated this false alarm of integer overflow at program point 2.

Organization. Section 2 illustrates the main framework of our method and how it works on our motivating example. Section 3 presents hierarchal variable dependency graph (HVDG) of loop and program slicing by hierarchal variables. Section 4 presents the definition, soundness and some strategies of relaxing. Section 5 describes a fix-point solver based on formula method. Section 6 presents discussions on soundness and precision of our method. Section 7 presents our experiment and evaluation. Section 8 discusses related work. Section 9 gives conclusions as well as future work.

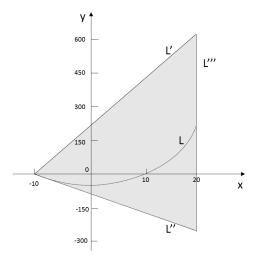


Fig. 1. Motivation Example

### II. OVERVIEW

In the actual program, we can easily find that there is a hierarchical dependency between the variables in the loop. For example, loop control variables (such as loop counter) often do not depend on other variables in the loop, besides relying on themselves or some input; many variables depend on loop control variables in one direction. If you use the abstract domain to analyze all the variables in the loop at the same time, it is very likely that there are too many unstable factors in the two iterations (for example, many variable values are changing). After widening, the precision loss is very large. Especially for programs such as Motivating example with nonlinear behavior, if the linear abstraction domain is used to analyze all the variables at the same time, it is easy to make the analysis inaccurate due to widening.

## III. VARIABLE LAYERING AND CYCLIC SLICING BASED ON VARIABLE DEPENDENT LAYERED GRAPHS

Hierarchal Variable Dependency GraphHVDG

A. Variable Dependency
Definition of VD

- B. Variable Dependency Graph
- 1) Some Definitions

Hasse Diagram

2) Construct VDG

We will introduce how to construct the VDG.

C. Variable layering

How to layer variables based on Hasse Diagram.

D. Slicing based on variable Hierarchy How to slice the loop by vh.

### IV. RELAXING TRANSFORMERS BASED ON PARTIAL LOOP INVARIANT

- A. Definition of Relax and its soundness

  Definition of Relax Soundness of Relax
- B. Relaxing Strategy
- 1) All variables relaxing strategy
- 2) Templated relaxing strategy
- (1)Linearization Relaxing of single assignments
- (2)Relational Relaxing of multiple assignments
- (3)Relaxing of single variable assignments
- V. COMPUTING FIX-POINT BY FORMULA METHOD
- A. Formula Method of single variable assignments
- B. Loop counter calculation by Formula Method
- C. Fix-point solver combining Kleene iteration and Formula Method

#### VI. DISCUSSION

Talk about the soundness and precision of our method.

# VII. EXPERIMENT AND EVALUATION VIII. CONCLUSION

The conclusion goes here.

APPENDIX A
PROOF OF THE FIRST ZONKLAR EQUATION
Appendix one text goes here.

APPENDIX B

Appendix two text goes here.

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### REFERENCES

[1] H. Kopka and P. W. Daly, *A Guide to LTEX*, 3rd ed. Harlow, England: Addison-Wesley, 1999.

Michael Shell Biography text here.

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John Doe Biography text here.

Jane Doe Biography text here.