



THE UNIVERSITY OF  
**WAIKATO**  
*Te Whare Wānanga o Waikato*

# Bound Analysis for Whieley Programs

## Inferring Integer Bounds for Efficient Code Generation

Min-Hsien Weng, Mark Utting and Bernhard Pfahringer  
Department of Computer Science at the University of Waikato

mw169@students.waikato.ac.nz, marku@waikato.ac.nz, bernhard@waikato.ac.nz

### Introduction

The Whieley programming language employs extended static checking to eliminate errors at the compile time, and compiles the high-level Whieley program into different kinds of implementations.[3] But translating high-leveled Whieley programs into efficient implementations has some challenges. For example, the use of arbitrary-sized integers downgrades the performance of Whieley implementation. The bound analyzer aims to assist the compiler to determine the efficient integer data types.

### Main Objectives

1. Analyze each bytecode of the Whieley program to produce the constraints (propagation rule).
2. Infer the bounds and keep track of all bounds to analyze the feasibility of fixed points.
3. Determine the efficient integer data types.

### Methods

Each integer at bytecode level has its own domain, which contains lower and upper bounds. And those constraints, produced from each bytecode, could restrict the domain to a finite set. In that case, solving the constraints over the finite constraint set (a.k.a constraint satisfaction problem) can be tackled with bound consistency.[2]

### Bound Consistency

Bound consistency technique can infer the bounds consistent with all the constraints by propagating the lower or upper bounds among the variables.

### Widening Operator

$$\begin{aligned} \perp \nabla [l_0, u_0] &= [l_0, u_0] \\ [l_0, u_0] \nabla \perp &= [l_0, u_0] \\ [l_0, u_0] \nabla [l_1, u_1] &= [\text{if } (l_1 < l_0) \text{ then } l_1 \text{ else } l_0, \\ &\quad \text{if } (u_0 < u_1) \text{ then } u_1 \text{ else } u_0] \end{aligned}$$

The widening operator  $\nabla$  in abstract interpretation converges the time of reaching the fixed points by extrapolating the bounds to  $\pm \text{inf}$ . [1] The modified widening operator can be applied on bound inference to propagate the wider bounds and take the union of other bounds.

### Class Diagram

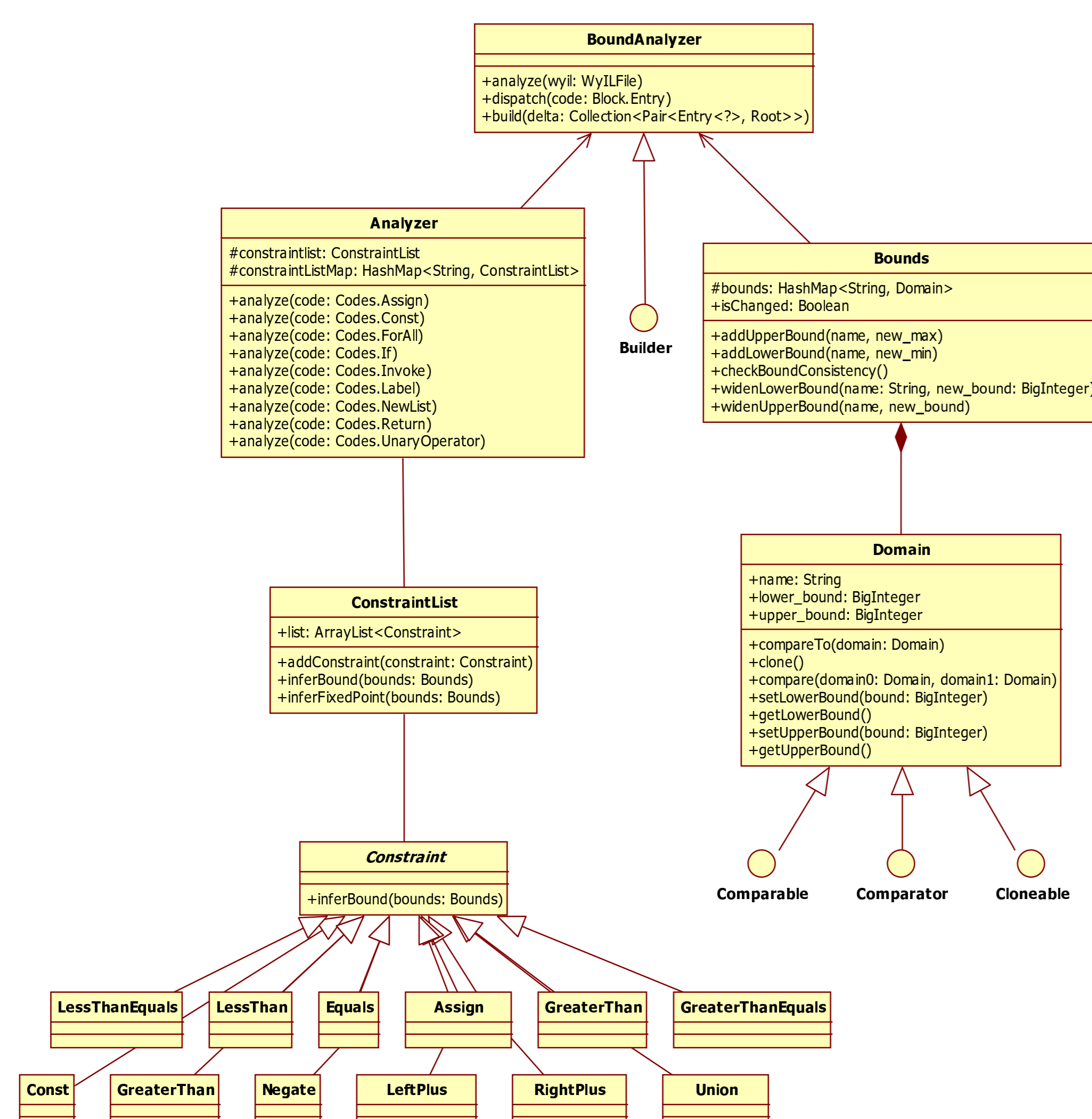


Figure 1: Class Diagram of Bound Analyzer

The bound analyzer is built on top of Whieley compiler project as a new module with extensive interfaces and classes in Figure 1. It first uses the Whieley compiler to compile the Whieley program into the in-memory WyIL (Whieley Intermediate Language) code. Then it dispatches each byte-code to the specific analysis method accordingly for adding the constraints to the list or branching out the constraint list. After iterating over all the byte-code of a function, it infers the bounds of each list and take the union of the available bounds to produce the aggregated bound analysis results.

### Analysis Result

The bound analyzer is used to analyze the below Whieley program:

```
function f(int x) => int:
  if x < 10:
    return 1
  else:
    if x > 10:
      return 2
    return 0
```

It branches the constraint list for if/else statement and outputs the below analysis results:

```
int f(int):
f.0 [ const %2 = 10 : int]
f.1 [ ifge %0, %2 goto blklab0 : int]
f.2 [ const %3 = 1 : int]
f.3 [ return %3 : int]
f.4 [ .blklab0]
f.5 [ const %5 = 10 : int]
f.6 [ ifle %0, %5 goto blklab2 : int]
f.7 [ const %6 = 2 : int]
f.8 [ return %6 : int]
f.9 [ .blklab2]
f.10 [ .blklab1]
f.11 [ const %7 = 0 : int]
f.12 [ return %7 : int]
```

```
Union Bounds:
Bounds [
  D(%0) = [-infinity..9]
  D(%0_blklab0) = [10..infinity]
  D(%0_blklab2) = [-infinity..10]
  D(%2) = [10..10]
  D(%3) = [1..1]
  D(%5) = [10..10]
  D(%6) = [2..2]
  D(%7) = [0..0]
  D(return) = [0..2]
]
```

isBoundConsistency=true

The analysis results show that the input parameter (%0) has an infinite domain while the return value of  $f(x)$  is restricted to a finite range ([0..2]), whose values can be stored with a short integer sufficiently.

### Conclusions

The bound analyzer can

- add the constraints and infer the bounds for each function in Whieley.
- branch out the constraint list to produce the aggressive analysis results.
- provides an extensible architecture to include more constraints and analysis.

### Forthcoming Research

The performance issues on the Whieley implementation include the unbounded integers, unbounded data structures and extra-value copying problems, etc. By solving those problems, I plan to develop a Whieley compiler to generate the efficient and reliable OpenCL code.

### References

- [1] Agostino Cortesi. Widening operators for abstract interpretation. In *Sixth IEEE International Conference on Software Engineering and Formal Methods, SEFM 2008, Cape Town, South Africa, 10-14 November 2008*, pages 31–40, 2008.
- [2] K. Marriott and P.J. Stuckey. *Programming with Constraints: An Introduction*. Adaptive Computation and Machine. MIT Press, 1998.
- [3] David J. Pearce. The Whieley Language Specification. Technical report, Victoria University of Wellington, 2014. Available at <http://whieley.org/download/WhieleyLanguageSpec.pdf>.

### Acknowledgements

Thank Dr. David J. Pearce (Whieley creator) for technique support on the Whieley compiler.