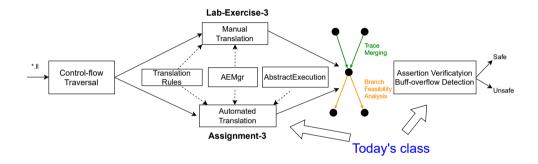
Code Verification using Abstract Interpretation

(Week 9)

Yulei Sui

School of Computer Science and Engineering University of New South Wales, Australia

Today's class



Topological Order

- ? How to analyze a program free of loop?
- ✓ Analyze each node once adhering to the topological order on the acyclic control-flow graph of the program.

Topological Order

Analysis Order of Nodes on Control-Flow Graph

- ? How to analyze a program free of loop?
- ✓ Analyze each node once adhering to the topological order on the acyclic control-flow graph of the program.

A **topological order** of a graph G(V, E) is a linear ordering of its nodes such that for every directed edge $a \to b$, node a always precedes node b in the ordering.

- Must be a direct acyclic graph (DAG) and has at least one topo ordering.
- The ordering respects the **direction of edges**.

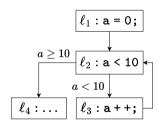
Example of topological order:



Analysis Order of Nodes on Control-Flow Graph

- ? How to analyze a program containing loops?
- ✓ We can analyze a program containing loops adhering to the weak topological order (WTO) on its control flow graph.

What is the weak topological order?

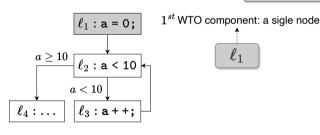


Control Flow Graph

Analysis Order of Nodes on Control-Flow Graph

- How to analyze a program containing loops?
- ✓ We can analyze a program containing loops adhering to the weak topological order (WTO) on its control flow graph.

What is the weak topological order?

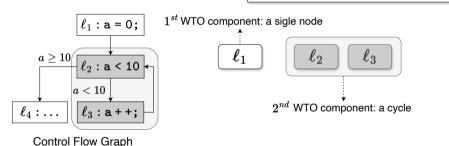


Control Flow Graph

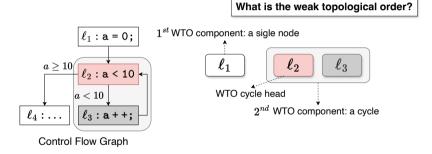
Analysis Order of Nodes on Control-Flow Graph

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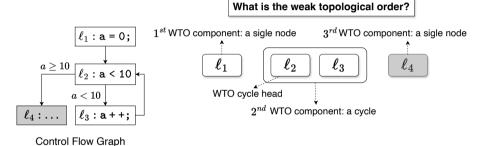
What is the weak topological order?



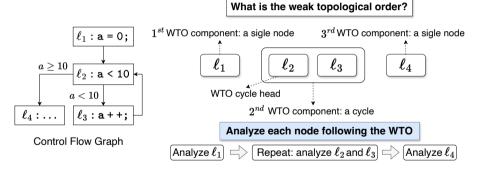
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- ✓ We can analyze a program containing loops adhering to the weak topological order (WTO) on its control flow graph.



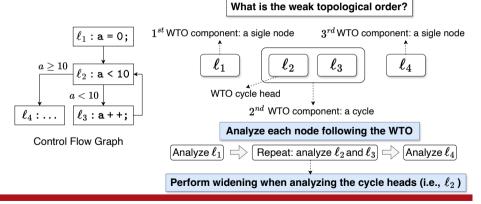
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- ? How to analyze a program containing loops?
- ✓ We can analyze a program containing loops adhering to the weak topological order (WTO) on its control flow graph.



WTO, Widening and Narrowing

Why Weak Topological Order?

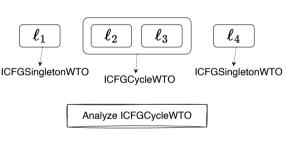
- Handling cyclic dependencies
- Efficient fixed-point computation

Why Widening?

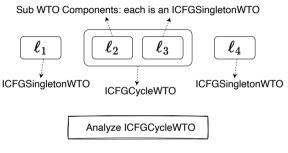
- Over-approximation
- Prevent non-termination

Why Narrowing?

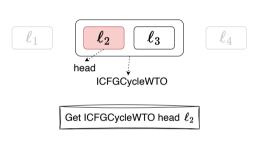
- Refine precision after widening converges
- The specific conditions or constraints used for narrowing:
 - Loop exit conditions (this course)
 - Type constraints (8-bit integer ranging from [-128, 127])
 - Bounds from arithmetic operations If x = y + z, and y ∈ [1, 5] and z ∈ [2, 3], then x ∈ [3, 8]. If widening gives [1, 10], narrowing can refine this to [3, 8].
 - User-specification (assertions and guard conditions)



Algorithm 1: Abstract execution guided by WTO (part 2) Function handleCycleWTO(cycle): $cvcle_head := cvcle \rightarrow head() \rightarrow node() :$ increasing := true : cur_iter := 0 : while true do cur iter++: if cur iter > Options :: WidenDelay() then prev_head_state := postAbsTrace[cvcle_head]: handleSingletonWTO(cycle -> head()); cur_head_state := postAbsTrace[cvcle_head]; if increasing then postAbsTrace[cycle_head] := prev_head_state.widen(cur_head_state); if postAbsTrace[cycle_head] == prev_head_state then increasing := false: continue; else postAbsTrace[cvcle_head] := prev_head_state.narrow(cur_head_state): if postAbsTrace[cvcle_head] == prev_head_state then break: else 20 handleSingletonWTO(cvcle -> head()): handleWTOComponents(cycle -> getWTOComponents());

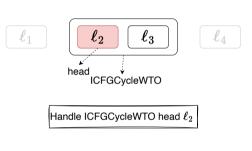


```
Algorithm 2: Abstract execution guided by WTO (part 2)
  Function handleCycleWTO(cycle):
      cvcle_head := cvcle \rightarrow head() \rightarrow node() :
      increasing := true :
      cur_iter := 0 :
      while true do
          cur iter++:
          if cur iter > Options :: WidenDelay() then
              prev_head_state := postAbsTrace[cvcle_head]:
              handleSingletonWTO(cycle -> head());
              cur_head_state := postAbsTrace[cycle_head];
              if increasing then
                  postAbsTrace[cvcle_head] := prev_head_state.widen(cur_head_state) :
                  if postAbsTrace[cycle_head] == prev_head_state then
                      increasing := false:
                      continue;
              else
                  postAbsTrace[cvcle_head] := prev_head_state.narrow(cur_head_state):
                  if postAbsTrace[cvcle_head] == prev_head_state then
                      break:
20
          else
              handleSingletonWTO(cvcle -> head()):
          handleWTOComponents(cycle -> getWTOComponents());
```



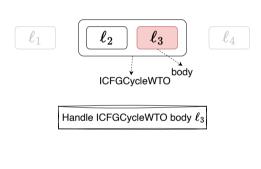
Algorithm 3: Abstract execution guided by WTO (part 2)

```
Function handleCycleWTO(cycle):
      cycle\ head := cycle \rightarrow head() \rightarrow node():
      increasing := true :
      cur_iter := 0 ;
      while true do
          cur iter++
          if cur_iter > Options :: WidenDelay() then
               prev_head_state := postAbsTrace[cvcle_head]:
               handleSingletonWTO(cycle→head());
               cur_head_state := postAbsTrace[cvcle_head]:
10
               if increasing then
                   postAbsTrace[cycle_head] := prev_head_state.widen(cur_head_state) :
                   if postAbsTrace[cycle_head] == prev_head_state then
13
                       increasing := false;
                       continue:
                   postAbsTrace[cycle_head] := prev_head_state.narrow(cur_head_state) :
                   if postAbsTrace[cvcle_head] == prev_head_state then
                      break:
           موام
20
              handleSingletonWTO(cvcle->head()):
21
           handleWTOComponents(cvcle-)getWTOComponents());
22
```



Algorithm 4: Abstract execution guided by WTO (part 2)

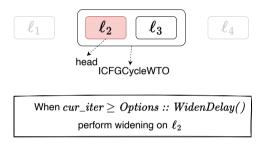
```
Function handleCycleWTO(cycle):
      cvcle\_head := cvcle \rightarrow head() \rightarrow node() :
      increasing := true :
      cur_iter := 0 ;
      while true do
          cur iter++:
          if cur_iter > Options :: WidenDelay() then
               prev_head_state := postAbsTrace[cvcle_head]:
               handleSingletonWTO(cycle→head());
               cur_head_state := postAbsTrace[cycle_head];
               if increasing then
                   postAbsTrace[cvcle_head] := prev_head_state.widen(cur_head_state);
12
                   if postAbsTrace[cycle_head] == prev_head_state then
                       increasing := false:
                       continue:
               else
                   postAbsTrace[cycle_head] := prev_head_state.narrow(cur_head_state) :
                   if postAbsTrace[cvcle_head] == prev_head_state then
                      break:
           else
20
               handleSingletonWTO(cvcle->head());
21
          handleWTOComponents(cvcle->getWTOComponents());
22
```



Algorithm 5: Abstract execution guided by WTO (part 2)

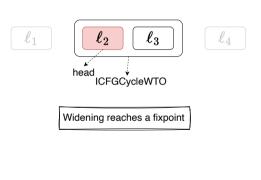
```
Function handleCvcleWTD(cvcle):
      cycle head := cycle -> head() -> node() :
      increasing := true :
      cur iter := 0:
      while true do
          cur iter++:
          if cur iter > Options :: WidenDelay() then
               prev_head_state := postAbsTrace[cycle_head];
              handleSingletonWTO(cvcle -> head());
              cur_head_state := postAbsTrace[cvcle_head]:
10
              if increasing then
                  postAbsTrace[cvcle_head] := prev_head_state.widen(cur_head_state) :
                  if postAbsTrace[cvcle_head] == prev_head_state then
                      increasing := false:
                      continue:
15
                  postAbsTrace[cycle_head] := prev_head_state.narrow(cur_head_state);
                  if postAbsTrace[cvcle_head] == prev_head_state then
                      break:
          else
20
              handleSingletonWTO(cvcle-head()):
21
          handleWTOComponents(cycle-)getWTOComponents());
22
```

Note: getIWTOcomponents returns Cycle WTO body, i.e., ℓ_3



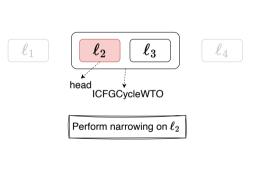
Algorithm 6: Abstract execution guided by WTO (part 2)

```
Function handleCvcleWTO(cvcle):
      cvcle\_head := cvcle \rightarrow head() \rightarrow node() :
      increasing := true :
      cur_iter := 0 :
       while true do
           cur_iter++:
           if cur_iter > Options :: WidenDelay() then
               prev_head_state := postAbsTrace[cycle_head];
               handleSingletonWTO(cycle -> head());
               cur_head_state := postAbsTrace[cvcle_head]:
               if increasing then
                   postAbsTrace[cycle_head] := prev_head_state.widen(cur_head_state);
12
                   if postAbsTrace[cvcle_head] == prev_head_state then
13
                       increasing := false:
14
                        continue:
15
               else
16
                   postAbsTrace[cvcle_head] := prev_head_state.narrow(cur_head_state) :
17
                   if postAbsTrace[cvcle_head] == prev_head_state then
18
                      break:
19
20
           else
               handleSingletonWTO(cvcle-head());
           handleWTOComponents(cycle→getWTOComponents());
22
```



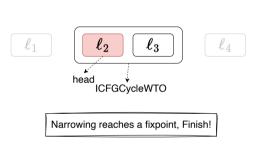
Algorithm 7: Abstract execution guided by WTO (part 2)

```
1 Function handleCvcleWTO(cvcle):
      cycle\_head := cycle \rightarrow head() \rightarrow node();
      increasing := true :
      cur_iter := 0 ;
      while true do
          cur iter++:
          if cur_iter > Options :: WidenDelay() then
              prev_head_state := postAbsTrace[cvcle_head]:
              handleSingletonWTO(cycle→head());
              cur_head_state := postAbsTrace[cvcle_head]:
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              if increasing then
                  postAbsTrace[cycle_head] := prev_head_state.widen(cur_head_state) :
                  if postAbsTrace[cycle_head] == prev_head_state then
                      increasing := false;
                      continue;
15
              else
                  postAbsTrace[cycle_head] := prev_head_state.narrow(cur_head_state) :
                  if postAbsTrace[cvcle_head] == prev_head_state then
                     break:
19
             handleSingletonWTO(cvcle->head()):
          handleWTOComponents());
```



Algorithm 8: Abstract execution guided by WTO (part 2)

```
Function handleCycleWTO(cycle):
      cvcle\_head := cvcle \rightarrow head() \rightarrow node() :
      increasing := true :
      cur_iter := 0 ;
      while true do
          cur iter++:
          if cur_iter > Options :: WidenDelay() then
               prev_head_state := postAbsTrace[cvcle_head]:
               handleSingletonWTO(cycle→head());
               cur_head_state := postAbsTrace[cycle_head];
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               if increasing then
                   postAbsTrace[cvcle_head] := prev_head_state.widen(cur_head_state);
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                   if postAbsTrace[cycle_head] == prev_head_state then
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               else
                   postAbsTrace[cycle_head] := prev_head_state.narrow(cur_head_state);
                   if postAbsTrace[cvcle_head] == prev_head_state then
                      break:
           موام
20
              handleSingletonWTO(cvcle->head()):
21
           handleWTOComponents(cvcle-)getWTOComponents());
22
```



Algorithm 9: Abstract execution guided by WTO (part 2)

```
1 Function handleCycleWTO(cycle):
      cycle_head := cycle \rightarrow head() \rightarrow node();
      increasing := true :
      cur_iter := 0 :
      while true do
          cur_iter++:
          if cur iter > Options :: WidenDelay() then
               prev_head_state := postAbsTrace[cycle_head];
              handleSingletonWTO(cycle -> head());
              cur_head_state := postAbsTrace[cycle_head];
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              if increasing then
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                      increasing := false:
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               else
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                  if postAbsTrace[cvcle_head] == prev_head_state then
                      break:
19
20
              handleSingletonWTO(cycle -> head());
          handleWTOComponents());
22
```

Abstract Interpretation on SVFIR

Week 9

Yulei Sui

School of Computer Science and Engineering University of New South Wales, Australia

Abstract Interpretation on Pointer-Free SVFIR

Interval Domain

- For simplicity, let's first consider abstract execution on a pointer-free language.
- This means there are no operations for memory allocation (like p = alloc_o) or for indirect memory accesses (such as p = *q or *p = q).
- Here are the pointer-free SVFSTMTs and their C-like forms:

| SVFSTMT | C-Like form |
|-------------------|---|
| ConsStmt | $\ell: p = c$ |
| COPYSTMT | $\ell: \mathtt{p} = \mathtt{q}$ |
| BINARYSTMT | $\ell:\mathtt{r}=\mathtt{p}\otimes\mathtt{q}$ |
| РніЅтмт | $\ell: \mathtt{r} = \mathtt{phi}(\mathtt{p_1}, \mathtt{p_2}, \ldots, \mathtt{p_n})$ |
| SEQUENCE | $\ell_1; \ell_2$ |
| BRANCHSTMT | ℓ_1 : if($x < c$) then ℓ_2 else ℓ_3 |

Abstract Interpretation on Pointer-Free SVFIR

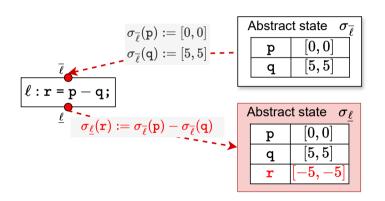
Interval Domain

Let's use the *Interval* abstract domain to update σ based on the following rules for different SVFSTMT:

| SVFSTMT | C-Like form | Abstract Execution Rule |
|------------|---|---|
| CONSSTMT | $\mid \; \ell : \mathtt{p} = \mathtt{c}$ | $\mid \ \sigma_{\underline{\ell}}(\mathtt{p}) := [\mathtt{c},\mathtt{c}]$ |
| СОРҮЅТМТ | $ \ell : p = q$ | $\mid \ \sigma_{\underline{\ell}}(\mathtt{p}) := \sigma_{\overline{\ell}}(\mathtt{q})$ |
| BINARYSTMT | $\big \ \ell: {\tt r} = {\tt p} \otimes {\tt q}$ | $\mid \ \sigma_{\underline{\ell}}(r) := \sigma_{\overline{\ell}}(p) \hat{\otimes} \sigma_{\overline{\ell}}(q)$ |
| РніЅтмт | $\big \ \ell: \mathtt{r} = \mathtt{phi}(\mathtt{p}_1,\mathtt{p}_2,\ldots,\mathtt{p}_n)$ | $\mid \ \sigma_{\underline{\ell}}(r) := \bigsqcup_{i=1}^n \sigma_{\overline{\ell}}(p_i)$ |
| SEQUENCE | $ \ell_1;\ell_2 $ | $\mid \forall v \in \mathbb{V}, \sigma_{\overline{\ell_2}}(v) \sqsupseteq \sigma_{\underline{\ell_1}}(v)$ |
| BRANCHSTMT | $\ell_1: if(x < c) then \ell_2 else \ell_3$ | $\begin{array}{c c} \sigma_{\overline{\ell_2}}(x) := \sigma_{\underline{\ell_1}}(x) \sqcap [-\infty, c-1], \text{ if } \sigma_{\underline{\ell_1}}(x) \sqcap [-\infty, c-1] \neq \perp \\ \sigma_{\overline{\ell_3}}(x) := \sigma_{\underline{\ell_1}}(x) \sqcap [c, +\infty], \text{ if } \sigma_{\underline{\ell_1}}(x) \sqcap [c, +\infty] \neq \perp \end{array}$ |

Abstract Interpretation on BINARYSTMT

| SVFSTMT | C-Like form | Abstract Execution Rule |
|------------|--|---|
| BINARYSTMT | $\ell: \mathtt{r} = \mathtt{p} \otimes \mathtt{q}$ | $\sigma_{\underline{\ell}}(r) := \sigma_{\overline{\ell}}(p) \hat{\otimes} \sigma_{\overline{\ell}}(q)$ |

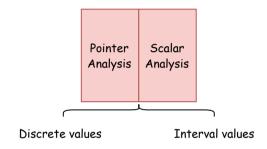


Abstract Interpretation in the Presence of Pointers

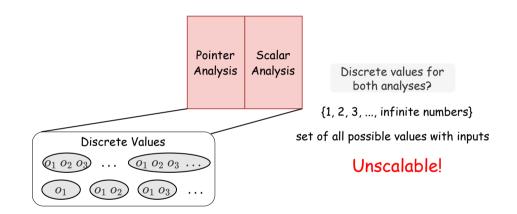
- SVFIR in the presence of pointers contain pointer-related statements including ADDRSTMT, GEPSTMT, LOADSTMT and STORESTMT.
- Abstract interpretation needs to be performed on a combined domain of intervals and addresses.

| SVFSTMT | C-Like form |
|---------------------------|--|
| CONSSTMT | $\ell: p = c$ |
| COPYSTMT | $\ell: \mathtt{p} = \mathtt{q}$ |
| BINARYSTMT | $\ell: \mathtt{r} = \mathtt{p} \otimes \mathtt{q}$ |
| РніЅтмт | $\ell: \mathtt{r} = \mathtt{phi}(\mathtt{p_1},\mathtt{p_2},\ldots,\mathtt{p_n})$ |
| SEQUENCE | $\ell_1; \ell_2$ |
| BRANCHSTMT | ℓ_1 : if($x < c$) then ℓ_2 else ℓ_3 |
| A DDR S TMT | $\ell: \mathtt{p} = \mathtt{alloc}$ |
| GEPSTMT | $\ell: p = \&(q \rightarrow i) \text{ or } p = \&q[i]$ |
| LOADSTMT | $\ell: p = *q$ |
| STORESTMT | $\ell: *p = q$ |

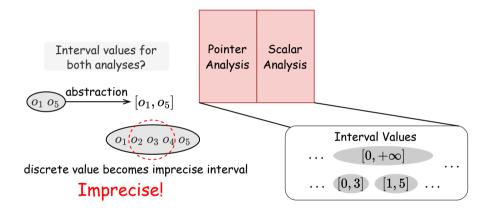
Combined Analysis



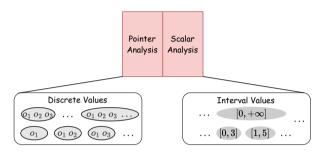
Combined Analysis Using Discrete Values



Combined Analysis Using Interval Values



Abstract Interpretation Over a Combined Domain

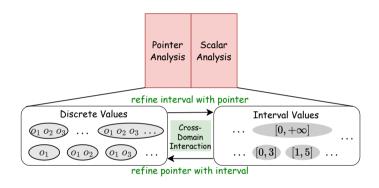


```
p = malloc(m*sizeof(int)); // p points to an array of size m
q = malloc(n*sizeof(int)); // q points to an array of size n
```

```
\mathbf{m} = \mathbf{r}[\mathbf{i}];
```

- The discrete values for points-to set of p, q depend on interval values of m and n.
- The interval value of m depends on the pointer aliasing between p, q and &r[i].
- Cyclic dependency between two domains requiring a bi-directional refinement. (variables highlighted in blue and red denote the discrete values and interval values dependent),

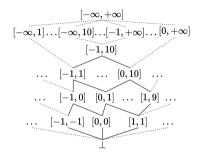
Abstract Interpretation Over a Combined Domain



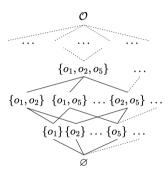
We require a combination of interval and memory address domains to precisely and efficiently perform abstract execution on SVFIR in the presence of pointers.

Abstract Interpretation over Interval and MemAddress Domains

A Combined Domain of Intervals and Discrete Memory Addresses



Interval domain for scalar variables



MemAddress domain for discrete memory address values

SVF Program Variables (SVFVar)

| | Program Variables | Domain | Meanings |
|--|-------------------|---|---|
| ObjVar $\mathbb{O} = \mathbb{S} \cup \mathbb{G} \cup \mathbb{H} \cup \mathbb{C}$ Memory Objects (constant data, stack, heap, glob (function objects are considered as global objectsFIObjVar $o \in (\mathbb{S} \cup \mathbb{G} \cup \mathbb{H})$ A single (base) memory objectGepObjVar $o_i \in (\mathbb{S} \cup \mathbb{G} \cup \mathbb{H}) \times \mathbb{P}$ i-th subfield/element of an (aggregate) objectConstantData \mathbb{C} Constant data (e.g., numbers and strings) | SVFVar | $\mathbb{V} = \mathbb{P} \cup \mathbb{O}$ | Program Variables |
| | ValVar | \mathbb{P} | Top-level variables (scalars and pointers) |
| FIObjVar $o \in (\mathbb{S} \cup \mathbb{G} \cup \mathbb{H})$ A single (base) memory objectGepObjVar $o_i \in (\mathbb{S} \cup \mathbb{G} \cup \mathbb{H}) \times \mathbb{P}$ i-th subfield/element of an (aggregate) objectConstantData \mathbb{C} Constant data (e.g., numbers and strings) | ObjVar | $\mathbb{O}=\mathbb{S}\cup\mathbb{G}\cup\mathbb{H}\cup\mathbb{C}$ | Memory Objects (constant data, stack, heap, global) |
| GepObjVar $o_i \in (\mathbb{S} \cup \mathbb{G} \cup \mathbb{H}) \times \mathbb{P}$ <i>i</i> -th subfield/element of an (aggregate) object ConstantData \mathbb{C} Constant data (e.g., numbers and strings) | | | (function objects are considered as global objects) |
| Constant Data C Constant data (e.g., numbers and strings) | FIObjVar | $o \in (\mathbb{S} \cup \mathbb{G} \cup \mathbb{H})$ | A single (base) memory object |
| | GepObjVar | $o_i \in (\mathbb{S} \cup \mathbb{G} \cup \mathbb{H}) 	imes \mathbb{P}$ | i-th subfield/element of an (aggregate) object |
| Program Statement $\ell \in \mathbb{L}$ Statements labels | ConstantData | \mathbb{C} | Constant data (e.g., numbers and strings) |
| | Program Statement | $\ell \in \mathbb{L}$ | Statements labels |

Abstract Trace for The Combined Domain

- For top-level variables \mathbb{P} , we use $\sigma \in \mathbb{L} \times \mathbb{P} \to \mathit{Interval} \times \mathit{MemAddress}$ to track the memory addresses or interval values of these variables.
- For memory objects \mathbb{O} , we use $\delta \in \mathbb{L} \times \mathbb{O} \to \mathit{Interval} \times \mathit{MemAddress}$ to track their abstract values

| | Notation | Domain | Data Structure Implementation |
|----------------|-----------------------------|--|-------------------------------|
| Abstract trace | σ | $\mathbb{L} 	imes \mathbb{P} 	o$ Interval $	imes$ MemAddress | preAbsTrace, postAbsTrace |
| | δ | $\mathbb{L} 	imes \mathbb{O} 	o \mathit{Interval} 	imes \mathit{MemAddress}$ | prorison acc, peculiac nacc |
| Abstract state | σ_{L} | $\mathbb{P} 	o \mathit{Interval} 	imes \mathit{MemAddress}$ | AbstractState.varToAbsVal |
| δ_L | | $\mathbb{O} 	o \mathit{Interval} 	imes \mathit{MemAddress}$ | AbstractState.addrToAbsVal |
| Abstract value | $\delta_L(p)$ $\delta_L(o)$ | Interval × MemAddress | AbstractValue |

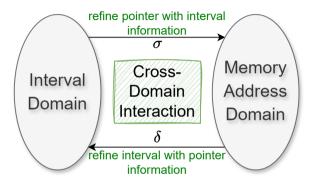
- *Interval* is used for tracking the interval value of **scalar variables** \mathbb{P} .
- MemAddress is used for tracking the memory addresses of memory address variables

 .

Implementation of Abstract State and Abstract Trace

- For a program point L, the abstract state is an instance of the class named AEState, consisting of:
 - Top-level variable, $varToAbsVal : \sigma_I \in \mathbb{P} \to Interval \times MemAddress$
 - Memory object, $addrToAbsVal : \delta_I \in MemAddress \rightarrow Interval \times MemAddress$
- The abstract trace has two maps, preAbsTrace and postAbsTrace, which
 maintains abstract states before and after each ICFGNode respectively.
 - For an ICFGNode ℓ , $preAbsTrace(\ell)$ retrieves the abstract state $\langle \sigma_{\overline{\ell}}, \delta_{\overline{\ell}} \rangle$, and $postAbsTrace(\ell)$ represents $\langle \sigma_{\ell}, \delta_{\ell} \rangle$.
 - For each abstract state $\langle \sigma_{\overline{\ell}}, \delta_{\overline{\ell}} \rangle$ we use as [varId] to operate $\sigma_{\underline{\ell}}$ and use storeValue and loadValue to operate δ_{ℓ} .
 - Each variable's AbstractValue (e.g., as [VarId]) is initialized as \bot in an AbstractState before assigned a new value.
 - Each AbstractValue (e.g., as [VarId]) is a 2-element tuple consisting of an interval as [VarId].getInterval() and a memory address set as [Varid].getAddrs().

Abstract Trace for The Combined Domain



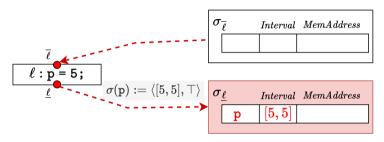
Abstract Execution Rules on SVFIR in the Presence of Pointers

Now let's use the *Interval* \times *MemAddress* abstract domain to update σ and δ based on the following rules for different SVFSTMT:

| SVFSTMT | C-Like form | Abstract Execution Rule |
|------------|--|--|
| CONSSTMT | $\ell: \mathtt{p} = \mathtt{c}$ | $\mid \sigma_{\underline{\ell}}(\mathtt{p}) := \langle [\mathtt{c},\mathtt{c}], \top \rangle$ |
| COPYSTMT | $\ell: \mathtt{p} = \mathtt{q}$ | $\mid \ \sigma_{\underline{\ell}}(\mathtt{p}) := \sigma_{\overline{\ell}}(\mathtt{q})$ |
| BINARYSTMT | $\ell: \mathtt{r} = \mathtt{p} \otimes \mathtt{q}$ | $\mid \ \sigma_{\underline{\ell}}(r) := \sigma_{\overline{\ell}}(p) \hat{\otimes} \sigma_{\overline{\ell}}(q)$ |
| РніЅтмт | $\ell: \texttt{r} = \texttt{phi}(\texttt{p}_1, \texttt{p}_2, \dots, \texttt{p}_n)$ | $\sigma_{\underline{\ell}}(r) := \bigsqcup_{i=1}^n \sigma_{\overline{\ell}}(p_i)$ |
| BRANCHSTMT | $\ell_1: if(x < c) then \ell_2 else \ell_3$ | $ \begin{vmatrix} \sigma_{\overline{\ell_2}}(x) := \sigma_{\underline{\ell_1}}(x) \sqcap [-\infty, c-1], & \text{if } \sigma_{\ell_1}(x) \sqcap [-\infty, c-1] \neq \bot \\ \sigma_{\overline{\ell_3}}(x) := \sigma_{\underline{\ell_1}}(x) \sqcap [c, +\infty], & \text{if } \sigma_{\underline{\ell_1}}(x) \sqcap [c, +\infty] \neq \bot \end{vmatrix} $ |
| SEQUENCE | $\ell_1;\ell_2$ | $\mid \ \delta_{\overline{\ell_2}} \sqsupseteq \delta_{\underline{\ell_1}}, \sigma_{\overline{\ell_2}} \sqsupseteq \sigma_{\underline{\ell_1}}$ |
| ADDRSTMT | $\ell: p = \mathtt{alloc_{o_i}}$ | $\mid \sigma_{\underline{\ell}}(\mathtt{p}) := \langle \top, \{o_i\} \rangle$ |
| GEPSTMT | $\ell: \mathtt{p} = \&(\mathtt{q} \to \mathtt{i}) \ or \mathtt{p} = \&\mathtt{q}[\mathtt{i}]$ | $\left \begin{array}{c} \sigma_{\underline{\ell}}(\mathtt{p}) := \bigsqcup_{\mathtt{o} \in \gamma(\sigma_{\overline{\ell}}(\mathtt{q}))} \bigsqcup_{j \in \gamma(\sigma_{\overline{\ell}}(\mathtt{i}))} \langle \top, \{\mathtt{o.fld}_j\} \rangle \end{array} \right.$ |
| LOADSTMT | $\ell: p = *q$ | $ \sigma_{\underline{\ell}}(\mathtt{p}) := \bigsqcup_{o \in \{o \mid o \in \sigma_{\overline{\ell}}(q)\}} \delta_{\overline{\ell}}(o)$ |
| STORESTMT | $\ell: *p = q$ | $\big \ \ \delta_{\underline{\ell}} := \big(\{ o \mapsto \sigma_{\overline{\ell}}(\mathtt{q}) o \in \gamma(\sigma_{\overline{\ell}}(\mathtt{p})) \} \sqcup \delta_{\underline{\ell}} \big)$ |

Abstract Execution on CONSSTMT

| SVFSTMT | C-Like form | Abstract Execution Rule |
|----------|---------------------------------|--|
| CONSSTMT | $\ell: \mathtt{p} = \mathtt{c}$ | $\sigma_{\underline{\ell}}(\mathtt{p}) := \langle [\mathtt{c},\mathtt{c}], \top \rangle$ |



Algorithm 10: Abstract Execution Rule for CONSSTMT

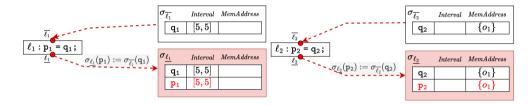
```
1 Function updateStateOnAddr(addr):
```

```
node = addr -> getICFGNode();
```

- as = getAbsStateFromTrace(node);
- 4 initObjVar(as, SVFUtil :: cast $\langle \text{ObjVar} \rangle (\text{addr} \rightarrow \text{getRHSVar}()));$
- $= as[addr \rightarrow getLHSVarID()] = as[addr \rightarrow getRHSVarID()];$

Abstract Execution on COPYSTMT

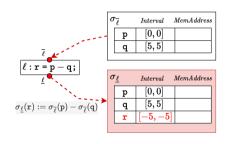
| SVFSTMT | C-Like form | Abstract Execution Rule |
|----------|---------------------------------|---|
| СОРУЅТМТ | $\ell: \mathtt{p} = \mathtt{q}$ | $\sigma_{\underline{\ell}}(\mathtt{p}) := \sigma_{\overline{\ell}}(\mathtt{q})$ |



Algorithm 11: Abstract Execution Rule for COPYSTMT

Abstract Execution on BINARYSTMT

| SVFSTMT | C-Like form | Abstract Execution Rule |
|------------|--|---|
| BINARYSTMT | $\ell: \mathtt{r} = \mathtt{p} \otimes \mathtt{q}$ | $\sigma_{\underline{\ell}}(r) := \sigma_{\overline{\ell}}(p) \hat{\otimes} \sigma_{\overline{\ell}}(q)$ |

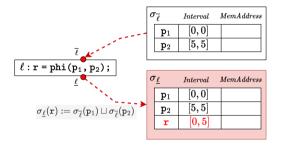


Algorithm 12: Abstract Execution Rule for BI-

```
NARYSTMT
1 Function updateStateOnBinary(binary):
       node = binary \rightarrow getICFGNode();
       as = getAbsStateFromTrace(node):
       op0 = binary \rightarrow getOpVarID(0);
       op1 = binary \rightarrow getOpVarID(1):
       res = binary \rightarrow getResID();
       if !as.inVarToValTable(op0) then
           as[op0] = IntervalValue :: top()
       if !as.inVarToValTable(op1) then
           as[op1] = IntervalValue :: top()
10
11
        as.inVarToValTable(op0)&&as.inVarToValTable(op1)
        then
12
           as[res] = as[op0] \hat{\otimes} as[op1]
```

Abstract Execution on PHISTMT

| SVFSTMT | C-Like form | Abstract Execution Rule |
|---------|--|---|
| РніЅтмт | $\ \ \ \ell : \texttt{r} = \texttt{phi}(\texttt{p}_1, \texttt{p}_2, \ldots, \texttt{p}_n)$ | $\sigma_{\underline{\ell}}(r) := \bigsqcup_{i=1}^n \sigma_{\overline{\ell}}(p_i)$ |



Algorithm 13: Abstract Execution Rule for PHISTMT

```
Function updateStateOnPhi(phi):

node = phi → getICFGNode();

as = getAbsStateFromTrace(node);

res = phi → getResID();

rhs = AbstractValue();

for i = 0; i < phi → getDpVarNum(); i + + do

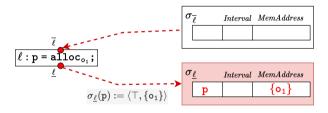
curld = phi → getOpVarID(i);

rhs.join_with(as[curld])

as[res] = rhs</pre>
```

Abstract Execution on ADDRSTMT

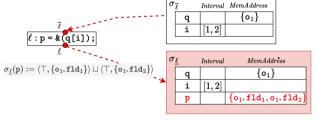




Algorithm 14: Abstract Execution Rule for ADDRSTMT

Abstract Execution on GEPSTMT

| SVFSTMT C-Like form | Abstract Execution Rule |
|---|---|
| $\label{eq:general_general} GEPSTMT \ \ \big \ \ \ell : \mathtt{p} = \&(\mathtt{q} \to \mathtt{i}) \ \ or \ \mathtt{p} = \&\mathtt{q}[\mathtt{i}]$ | $ \mid \ \sigma_{\underline{\ell}}(\mathtt{p}) := \bigsqcup_{\mathtt{o} \in \gamma(\sigma_{\overline{\ell}}(\mathtt{q}))} \bigsqcup_{j \in \gamma(\sigma_{\overline{\ell}}(\mathtt{i}))} \langle \top, \{\mathtt{o.fld}_j\} \rangle $ |



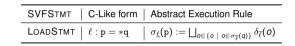
Algorithm 15: Abstract Execution Rule for GEPSTMT

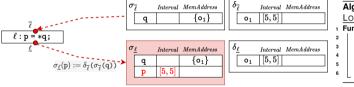
1 Function updateStateOnGep(gep):

```
2    node = gep → getICFGNode();
3    as = getAbsStateFromTrace(node);
4    rhs = gep → getRHSVarID();
5    lhs = gep → getLHSVarID();
```

as[lhs] = as.getGepObjAddrs(rhs, as.getElementIndex(gep));;

Abstract Execution on LOADSTMT

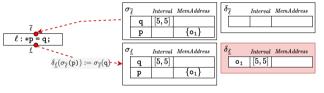




Algorithm 16: Abstract Execution Rule for LOADSTMT Function updateStateOnLoad(load): $node = load \rightarrow getICFGNode();$ as = getAbsStateFromTrace(node); $rhs = load \rightarrow getRHSVarID();$ $lhs = load \rightarrow getLHSVarID();$ as[lhs] = as.loadValue(rhs)

Abstract Execution on STORESTMT

| SVFSTMT C- | -Like form | Abstract Execution Rule |
|-------------------------|------------|---|
| STORESTMT $\mid \ell$: | *p = q | $\delta_{\underline{\ell}} := (\{ o \mapsto \sigma_{\overline{\ell}}(\mathtt{q}) o \in \gamma(\sigma_{\overline{\ell}}(\mathtt{p})) \} \sqcup \delta_{\underline{\ell}})$ |



Handling Cycles (Pseudo Code)

Algorithm 18: Abstract execution guided by WTO (part 2)

```
1 Function handleCvcleWTO(cvcle):
     cvcle_head := cvcle \rightarrow head() \rightarrow node() :
     increasing := true :
     cur_iter := 0 :
     while true do
        cur_iter++:
        if cur_iter > Options :: WidenDelay() then
            prev_head_state := postAbsTrace[cycle_head]:
            handleICFGNode(cvcle→head());
            cur_head_state := postAbsTrace[cycle_head];
10
            if increasing then
               postAbsTrace[cycle_head] := prev_head_state.widen(cur_head_state)
12
               if postAbsTrace[cvcle_head] == prev_head_state then
13
                  increasing := false;
                  continue:
15
            else
16
               postAbsTrace[cycle_head] := prev_head_state.narrow(cur_head_state)
17
               if postAbsTrace[cvcle_head] == prev_head_state then
18
19
                  break:
20
            handleICFGNode(cycle→head());
        handleWTOComponents()):
```

Algorithm 19: Handle WTO components

```
| Function handleCycleBody(Cycle):
| for it = cycle \rightarrow begin(); it! = cycle \rightarrow end(); + + it do |
| cur = *it; |
| if vertex = SVFUtil:: dyn_cast(ICFGWTONode)(cur) then |
| handleWTONode(vertex \rightarrow node()) |
| else if cycle2 = SVFUtil:: dyn_cast(ICFGWTOCycle)(cur) then |
| handleCycle(cycle2) |
| else |
| else |
| assert(false&&"unknownWTOtype!")
```

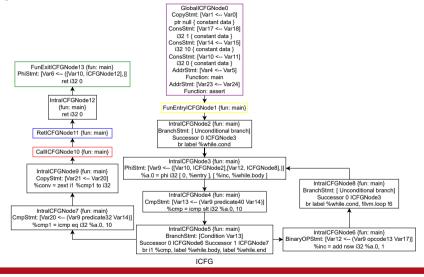
```
extern void assert(int);
int main(){
    int a = 0;
    while(a < 10) {
        a++;
    }
    assert(a = 10);
    return 0;
}</pre>
```

Compile to LLVM IR

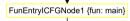


```
define dso local i32 @main() {
entry:
  br label %while.cond
while.cond:
  %a.0 = phi i32 [ 0, %entry ], [ %inc, %whi
  %cmp = icmp slt i32 %a.0, 10
  br i1 %cmp, label %while.body, label %while
while.body:
  %inc = add nsw i32 %a.0, 1
  br label %while.cond,
while end:
  %cmp1 = icmp eq i32 %a.0.10
  %conv = zext i1 %cmp1 to i32
  call void @assert(i32 noundef %conv)
  ret i32 0
```

LLVM IR



GloballCFGNode0
CopyStmt: [Var1 <-- Var0]
ptr null { constant data }
ConsStmt: [Var17 <-- Var18]
i32 1 { constant data }
ConsStmt: [Var14 <-- Var15]
i32 10 { constant data }
ConsStmt: [Var10 <-- Var11]
i32 0 { constant data }
AddrStmt: [Var4 <-- Var5]
Function: main
AddrStmt: [Var23 <-- Var24]
Function: assert



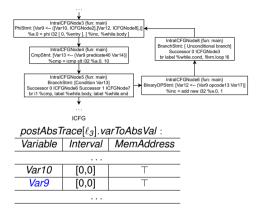
IntraICFGNode2 (fun: main)
BranchStmt: [Unconditional branch]
Successor 0 ICFGNode3
br label %while.cond



Algorithm 20: Abstract execution guided by WTO

$postAbsTrace[\ell_0].varToAbsVal:$

| 1 | P | | | |
|----------|----------|------------|--|--|
| Variable | Interval | MemAddress | | |
| Var0 | Т | {0x7f00} | | |
| Var1 | Т | {0x7f00} | | |
| Var18 | [1,1] | Т | | |
| Var17 | [1,1] | Т | | |
| Var14 | [10,10] | Т | | |
| Var15 | [10,10] | Т | | |
| Var10 | [0,0] | Т | | |
| Var11 | [0,0] | Т | | |
| | | • | | |



Algorithm 12: Abstract execution guided by WTO (part 2) 1 Function handleCycleWTD(cycle): cycle head := cycle -> head() -> node() : increasing := true : cur iter := 0 : while true do cur iter++ // cur iter = 1. Options :: WidenDelay() = 3: if cur_iter > Options :: WidenDelay() then prev_head_state := postAbsTrace[cycle_head]; handleICFGNode(cvcle-head()): 9 10 cur_head_state := postAbsTrace[cvcle_head]: if increasing then 11 12 postAbsTrace[cvcle_head] := prev_head_state.widen(cur_head_state); if postAbsTrace[cycle_head] == prev_head_state then 13

postAbsTrace[cvcle_head] := prev_head_state.narrow(cur_head_state) :

if postAbsTrace[cvcle_head] == prev_head_state then

else

_ handleICFGNode(cycle→head());
handleWT0Components(cycle→getWTOComponents());

continue:

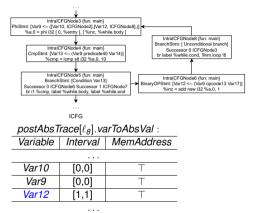
break:

16

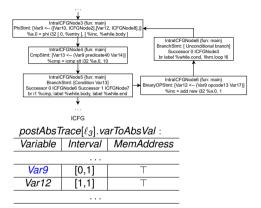
17

22

increasing := false:



```
Algorithm 12: Abstract execution guided by WTO (part 2)
  Function handleCvcleWTO(cvcle):
      cvcle_head := cvcle \rightarrow head() \rightarrow node() :
      increasing := true :
      cur_iter := 0 // cur_iter = 1. Options :: WidenDelay() = 3:
      while true do
          cur iter++:
          if cur iter > Ontions : WidenDelay() then
              prev_head_state := postAbsTrace[cvcle_head];
              handleICFGNode(cvcle -> head()):
9
              cur head state := postAbsTrace[cvcle head]:
10
              if increasing then
11
                  postAbsTrace[cycle_head] := prev_head_state_widen(cur_head_state) :
12
13
                  if postAbsTrace[cycle_head] == prey_head_state then
                       increasing := false:
15
                       continue:
16
17
                  postAbsTrace[cycle head] := prev_head_state_parrow(cur_head_state) :
                  if postAbsTrace[cycle_head] == prev_head_state then
18
                       break:
20
              handleTCFGNode(cvcle-head()):
          handleWTOComponents(cvcle-) aetWTOComponents());
22
```



1 Function handleCycleWTD(cycle): cycle head := cycle -> head() -> node() : increasing := true : cur iter := 0 : while true do cur iter++ // cur iter = 2. Options :: WidenDelay() = 3: if cur_iter > Options :: WidenDelay() then prev_head_state := postAbsTrace[cycle_head]; handleICFGNode(cvcle-head()): 9 10 cur_head_state := postAbsTrace[cvcle_head]: if increasing then 11 12 postAbsTrace[cvcle_head] := prev_head_state.widen(cur_head_state);

if postAbsTrace[cycle_head] == prev_head_state then

if postAbsTrace[cvcle_head] == prev_head_state then

postAbsTrace[cvcle_head] := prev_head_state.narrow(cur_head_state) :

Algorithm 12: Abstract execution guided by WTO (part 2)

else
| handleICFGNode(cycle->head());
| handleITCGmponents()cycle->celWTCComponents());

continue:

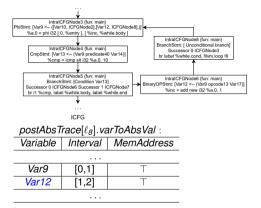
increasing := false:

13

16

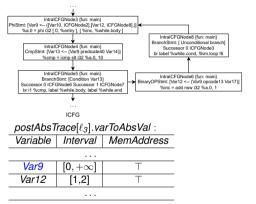
17

22

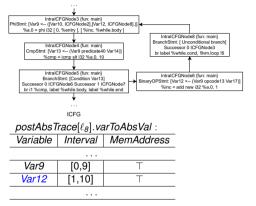


Algorithm 12: Abstract execution guided by WTO (part 2)

```
1 Function handleCycleWTD(cycle):
      cycle head := cycle -> head() -> node() :
      increasing := true :
      cur iter := 0 :
      while true do
          cur iter++ // cur iter = 2. Options :: WidenDelay() = 3:
          if cur_iter > Options :: WidenDelay() then
              prev_head_state := postAbsTrace[cycle_head];
              handleICFGNode(cvcle-head()):
9
10
              cur_head_state := postAbsTrace[cvcle_head]:
              if increasing then
11
12
                  postAbsTrace[cvcle_head] := prev_head_state.widen(cur_head_state);
                  if postAbsTrace[cycle_head] == prev_head_state then
13
                      increasing := false:
                      continue:
16
                  postAbsTrace[cvcle_head] := prev_head_state.narrow(cur_head_state) :
17
                  if postAbsTrace[cvcle_head] == prev_head_state then
                      break:
              handleICFGNode(cvcle→head());
          handleWTOComponents(cvcle-) aetWTOComponents());
22
```

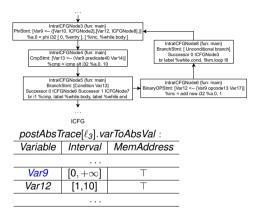


Algorithm 12: Abstract execution guided by WTO (part 2) Function handleCycleWTD(cycle): cvcle_head := cvcle -> head() -> node() : increasing := true : cur_iter := 0 : while true do cur_iter++ // cur_iter = 3. Options :: WidenDelay = 3: if cur_iter > Options :: WidenDelay() then prev_head_state := postAbsTrace[cvcle_head]; . handleICFGNode(cvcle -> head()): cur_head_state := postAbsTrace[cvcle_head]; 10 if increasing then 11 postAbsTrace[cvcle_head] := prev_head_state.widen(cur_head_state) : 12 if postAbsTrace[cycle head] == prev_head_state then 13 increasing := false; continue; 16 postAbsTrace[cycle_head] := prev_head_state_parrow(cur_head_state) : 17 if postAbsTrace[cvcle_head] == prev_head_state then break: 20 21 handleICFGNode(cvcle-head()): 22 handleWTOComponents(cvcle-) getWTOComponents());

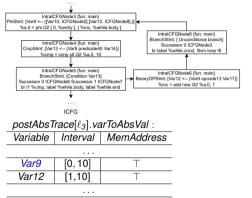


Algorithm 12: Abstract execution guided by WTO (part 2)

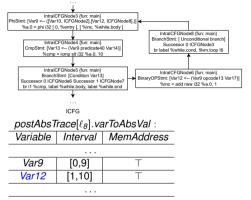
```
1 Function handleCycleWTD(cycle):
      cycle head := cycle -> head() -> node() :
      increasing := true :
      cur iter := 0 :
      while true do
          cur iter++:
          if cur_iter > Options :: WidenDelay() then
              prev_head_state := postAbsTrace[cycle_head]:
              handleICFGNode(cvcle-head()):
9
10
              cur_head_state := postAbsTrace[cvcle_head]:
              if increasing then
11
12
                  postAbsTrace[cvcle_head] := prev_head_state.widen(cur_head_state);
                  if postAbsTrace[cycle_head] == prev_head_state then
13
                      increasing := false:
                      continue:
16
                  postAbsTrace[cvcle_head] := prev_head_state.narrow(cur_head_state) :
17
                  if postAbsTrace[cvcle_head] == prev_head_state then
                      break:
              handleICFGNode(cvcle→head());
          handleWTOComponents(cvcle \rightarrow getWTOComponents()) // cur\_iter \equiv 3;
22
```



```
Algorithm 12: Abstract execution guided by WTO (part 2)
1 Function handleCvcleWTO(cvcle):
      cycle head := cycle -> head() -> node() :
      increasing := true :
      cur iter := 0:
      while true do
          cur_iter++ // cur_iter = 4:
          if cur iter > Options ·· WidenDelay() then
              prev_head_state := postAbsTrace[cycle_head]:
              handleICFGNode(cvcle -> head());
9
              cur_head_state := postAbsTrace[cvcle_head]:
10
11
              if increasing then
                  postAbsTrace[cycle_head] := prev_head_state.widen(cur_head_state);
12
                  if postAbsTrace[cvcle_head] == prev_head_state then
13
                      increasing := false;
                      continue;
15
16
                  postAbsTrace[cvcle_head] := prev_head_state.narrow(cur_head_state) :
17
                  if postAbsTrace[cycle head] == prev head state then
18
                      break:
20
              handleICFGNode(cvcle-head());
21
          handleWTOComponents(cvcle-) getWTOComponents());
22
```

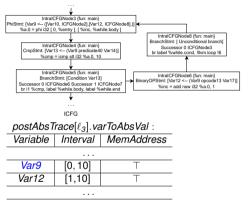


Algorithm 12: Abstract execution guided by WTO (part 2) 1 Function handleCvcleWTO(cvcle): cycle head := cycle -> head() -> node() : increasing := true : cur iter := 0 : while true do cur iter++ // cur iter = 5: if cur. iter > Options .. WidenDelay() then prev_head_state := postAbsTrace[cycle_head]; $handleICFGNode(cvcle \rightarrow head())$ // increasing \equiv false; 9 cur_head_state := postAbsTrace[cvcle_head]: 10 if increasing then 11 postAbsTrace[cycle_head] := prev_head_state.widen(cur_head_state); 12 if postAbsTrace[cvcle_head] == prev_head_state then 13 increasing := false: continue: postAbsTrace[cvcle_head] := prev_head_state.narrow(cur_head_state) : 17 if postAbsTrace[cycle_head] == prev_head_state then 18 break: موام 20 handleICFGNode(cvcle→head()); 21 handleWTOComponents(cvcle-) getWTOComponents()); 22



Algorithm 12: Abstract execution guided by WTO (part 2)

```
1 Function handleCycleWTD(cycle):
      cycle head := cycle -> head() -> node() :
      increasing := true :
      cur iter := 0 :
      while true do
          cur iter++:
          if cur_iter > Options :: WidenDelay() then
              prev_head_state := postAbsTrace[cycle_head]:
              handleICFGNode(cvcle-head()):
9
10
              cur_head_state := postAbsTrace[cvcle_head]:
              if increasing then
11
12
                  postAbsTrace[cvcle_head] := prev_head_state.widen(cur_head_state);
                  if postAbsTrace[cycle_head] == prev_head_state then
13
                      increasing := false:
                      continue:
16
                  postAbsTrace[cvcle_head] := prev_head_state.narrow(cur_head_state) :
17
                  if postAbsTrace[cvcle_head] == prev_head_state then
                      break:
              handleICFGNode(cvcle→head());
          handleWT0Components(cvcle \rightarrow getWTOComponents()) // cur\_iter \equiv 5;
22
```



```
Algorithm 12: Abstract execution guided by WTO (part 2)
1 Function handleCvcleWTO(cvcle):
      cycle head := cycle -> head() -> node() :
      increasing := true :
      cur_iter := 0 ;
      while true do
          cur_iter++ // cur_iter = 6:
          if cur iter > Options ·· WidenDelay() then
              prev_head_state := postAbsTrace[cycle_head]:
              handleICFGNode(cvcle \rightarrow head()) // increasing = false:
              cur_head_state := postAbsTrace[cvcle_head]:
10
11
              if increasing then
                  postAbsTrace[cycle_head] := prev_head_state.widen(cur_head_state);
12
                  if postAbsTrace[cycle_head] == prev_head_state then
13
                      increasing := false:
                      continue:
16
                  postAbsTrace[cycle_head] := prev_head_state.narrow(cur_head_state);
                  if postAbsTrace[cvcle_head] == prev_head_state then
                      break:
20
              handleICFGNode(cvcle→head());
22
          handleWTOComponents(cvcle-) getWTOComponents());
```

