# « Combination of Abstractions in the ASTRÉE Static Analyzer »

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### Astrée objectives

- ASTRÉE is a static program analyzer [2, 3, 7, 10] based on abstract interpretation [5, 6]
- ASTRÉE used to prove automatically the absence of run time errors in C programs<sup>2</sup>
- ASTRÉE is applied to large industrial embedded control/command safety-critical synchronous real-time software
- ASTRÉE is efficient and very precise for its application domain
- ASTRÉE was recently extended [13] to handle other kinds (e.g. communication) of embedded software, some of which are handwritten (using union, pointer arithmetics, etc).

 $<sup>^2</sup>$  without recursion, dynamic memory allocation and library calls.

#### Astrée design

ASTRÉE was designed using:

- a syntax-directed representation of the program control flow (functions, block structures);
- functional representation of abstract environments with sharing
   [2], for memory and time efficiency, and limited support for analysis parallelization [15];
- basic abstract domains, tracking variables independently (integer and floating-point intervals [4] using staged widenings);
- relational abstract domains tracking dependencies between variables
  - symbolic computation and linearization of expressions [12],
  - packed octagons [14],



- application-aware domains (such as the ellipsoid abstract domain for digital filters [8] or the arithmetic-geometric progression abstract domain [9], e.g. to bound potentially diverging computations);
- abstract domains tracking dependencies between boolean variables and other variables (boolean partitioning domain [3]), or the history of control flow branches and values along the execution trace (trace partitioning domain [11]);
- a memory abstract domain [3] recently extended to cope with unions and pointer arithmetics<sup>3</sup> [13].
- abstract domains are parametrized<sup>4</sup> and applied locally<sup>5</sup> [3].

- <sup>4</sup> e.g. maximal height of decision trees.
- <sup>5</sup> e.g. to variables packs.

<sup>&</sup>lt;sup>3</sup> Contrary to many program analysis systems, ASTRÉE does not have separate phases for pointer/aliasing analysis and arithmetic analysis.

# Motivation for the combination of abstract domains

#### Different Classes of Run-time Errors

- 1. Errors terminating the execution <sup>6</sup>. ASTRÉE warns and continues by taking into account only the executions that did not trigger the error.
- 2. Errors not terminating the execution with predictable outcome<sup>7</sup>. ASTRÉE warns and continues with worst-case assumptions.
- 3. Errors not terminating the execution with <u>unpredictable</u> outcome<sup>8</sup>. ASTRÉE warns and continues by taking into account only the executions that did not trigger the error.
- 3. is sound with respect to C standard, unsound with respect to C implementation, unless no false alarm.
  - $\frac{6}{7}$  floating-point exceptions e.g. (invalid operations, overflows, etc.) when traps are activated
  - $^7$  e.g. overflows over signed integers resulting in some signed integer.

<sup>8</sup> e.g. memory corruptionss.

#### Origins of False Alarms

- 1. Imprecise abstract transformer  $\Rightarrow$  fix algorithm
- 2. Imprecise parametrization  $\Rightarrow$  fix parameters
- 3. Imprecise widening  $\Rightarrow$  fix algorithm
- 4. Inepressive combination of abstract domains  $\Rightarrow$ 
  - must introduce new abstract domain
  - without redesigning existing abstract domains
  - but with interactions and reductions with existing abstract domains to enhance global precision

Abstract domains

#### Abstract domains

- Abstract domain role: encapsulate a class of program properties
- Abstract domain structure:
  - Abstract sets of execution trace fragments, as defined by a concretization function
  - Data structures for abstract properties encoding concrete properties of trace fragments
  - Sound algorithms for logical structure (approximation preorder, etc.)
  - Sound algorithms for transformers (post-image, etc.)
  - Sound extrapolators (widening/narrowing)
  - Communication channels to implement an approximate reduced product of abstractions

#### Abstract domain constructors

- Non-relational lifting: non-relational abstract domain D on values  $\mapsto$  abstract domain  $\prod_{X \in Var} D$  on all variables (using balanced binary trees)
- Relational lifting: relational abstract domain D(P) on packs  $P \subseteq Var$  of variables  $\mapsto$  abstract domain D(Var) on all variables
- Trace partitionning: past history abstraction domain <sup>9</sup> × current memory state abstraction domain → prefix traces abstraction domain (using maps implemented as trees) [11]
- Boolean partitionning: prefix traces abstraction domain  $\times$  boolean variables  $\mapsto$  prefix traces abstraction domain (using decision trees)

<sup>&</sup>lt;sup>9</sup> (e.g. a sub-sequence of branches taken

# Reductions

#### Precondition refinement

- Use information provided by other abstract domains to improve the precondition of a transformer
- Example: ellipsoid domain for filters:

- If no precondition of the required form is available, so synthesize one from
  - the interval domain (for Y and Z)
  - the symbolic domain (for Y = Z?)

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#### Postcondition refinement

- Use information provided by other abstract domains to improve the postcondition of a transformer
- Two cases:
  - Information computed by a domain propagated to its underlying domains
  - Information resquested by a domain missing the information

# Example of postcondition refinement of underlying domains

Code fragment computing an absolute value:

Program	Intervals	Octagons
	$Y \in [-\infty, +\infty]$	
Х=Υ;	$X,Y\in [-\infty,+\infty]$	X = Y
if (X <o) td="" {<=""><td><math>\mathtt{X} \in [-\infty, -1], \mathtt{Y} \in [-\infty, +\infty]</math></td><td>X = Y &lt; 0</td></o)>	$\mathtt{X} \in [-\infty, -1], \mathtt{Y} \in [-\infty, +\infty]$	X = Y < 0
X=-Y;	$X,Y\in [-\infty,+\infty]$	X = -Y > 0
} else {	$X \in [0, +\infty], Y \in [-\infty, +\infty]$	$X = Y \ge 0$
}	$X \in [-\infty, +\infty], Y \in [-\infty, +\infty]$	$-\mathtt{X}\leqslant\mathtt{Y}\leqslant\mathtt{X}$
if (X<100){	$X \in [-\infty, 99], Y \in [-\infty, +\infty]$	$-X \leqslant Y \land Y \leqslant X \leqslant 99$
Y		
}		

Intervals with postcondition refinement by octagons: the octagons domains receives ranges of variables from interval domain, reduce them and send back the result to the interval domain.

Program	Reduced ntervals	Octagons
	$Y \in [-\infty, +\infty]$	
Х=Υ;	X,Y $\in [-\infty,+\infty]$	X = Y
if (X <o) td="" {<=""><td><math>\mathtt{X} \in [-\infty, -1], \mathtt{Y} \in [-\infty, -1]</math></td><td>X = Y &lt; 0</td></o)>	$\mathtt{X} \in [-\infty, -1], \mathtt{Y} \in [-\infty, -1]$	X = Y < 0
X=-Y;	$\mathtt{X} \in [\mathtt{1},+\infty], \mathtt{Y} \in [-\infty,-1]$	X = -Y > 0
<pre>} else {</pre>	$X \in [0, +\infty], Y \in [0, +\infty]$	$X = Y \ge 0$
}	$X \in [0, +\infty], Y \in [-\infty, +\infty]$	$-\mathtt{X}\leqslant\mathtt{Y}\leqslant\mathtt{X}$
if (X<100){	$X \in [0, 99], Y \in [-99, 99]$	$ -X \leqslant Y \land Y \leqslant X \leqslant 99 $
Y		
}		

#### Example of information request

Analysis with the octagon domain

- Nothing is known on A whence on X
- Ask for an interval of A or X to the interval domain <sup>10</sup>
- Because the abstract domains are organized into a hierarchy, circularities are avoided

<sup>10</sup> The octagon domain is more precise than the interval domain but the interval domain might have benefitted from reductions from other domains.

Implementation as a networks of abstract domains



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#### Hierarchies of abstract domains



- Bottom-up evaluation
- Communication of abstract properties via common ancestor by communication primitives

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#### Abstract domain of messages

- $\text{set } IO^{\sharp}$  of abstract properties (messages sent/received by communication primitives)
- -concretization  $\gamma_{IO^{\sharp}}: IO^{\sharp} \to D$  (*D* is the set of concrete execution trace fragments)
- communication channels
  - $\top$ : initially, no information on channel
  - content read and modified by communication primitives

### Communication primitives

Each abstract domain  $(D^{\sharp}, \gamma_{D^{\sharp}})$  has two communication primitives:

- Emit abstract information on communication channels:
  - EXTRACT<sub> $D^{\sharp}$ </sub> :  $D^{\sharp} \times IO^{\sharp} \rightarrow IO^{\sharp}$
  - $-io' = \text{EXTRACT}_{D^{\sharp}}(c, io)$ :
    - *io*: contents of the output channel before the constraint is emitted,
    - c: abstract element in the abstract domain  $D^{\sharp}$ ,
    - io': content of the channel reduced by information extracted from c (hence the name EXTRACT).
  - $\begin{array}{l} \gamma_{D^{\sharp}}(c) \cap \gamma_{IO^{\sharp}}(io) \subseteq \gamma_{IO^{\sharp}}(\texttt{EXTRACT}_{D^{\sharp}}(c,io)) \text{ (reduction of communication channel)} \end{array}$

- Receive abstract information on communication channel:
  - $\operatorname{refine}_{D^{\sharp}}: D^{\sharp} \times IO^{\sharp} \to D^{\sharp}$
  - $-c' = \operatorname{REFINE}_{D^{\sharp}}(c, io)$ :
    - c: element of the abstract domain
    - *io*: abstract information on the input channel
    - c': refinement for c by the received abstract information (hence the name REFINE)
  - $\begin{array}{l} \gamma_{D^{\sharp}}(c) \cap \gamma_{IO^{\sharp}}(io) \subseteq \gamma_{D^{\sharp}}(\texttt{REFINE}_{D^{\sharp}}(c,io)) \ (\texttt{reduction of abstract property}) \end{array}$

# Improving the precision of widenings

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Widening precision improvement strategies

- Delaying widenings: Replace  $\nabla$  by  $\cup$  finitely often
- Reducing widenings: Reduce result of ⊽ using information provided by other abstract domains



Delaying widenings

#### Problem with the delaying of widenings

- -Let  $\nabla$  be a widening on an abstract domain D
- Replacing  $\nabla$  by  $\cup$  improves precision
- However, fair replacement<sup>11</sup> of ⊽ by ∪ may no longer ensure termination

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 $<sup>^{11}</sup>$  any infinite iteration would have an unbounded number of widenings

#### Counter-example

- $egin{aligned} &-D^{\sharp} riangleq \{S \subseteq [0;1] \mid 0,1 \in S\} \ &-f(S) = S \cup \{rac{1}{2^{n+1}} \mid rac{1}{2^n} \in S\} \end{aligned}$
- $-a \triangledown_{D^{\sharp}} b = 
  ho(a, a \cup b)$
- $-\rho(a, b)$  is obtained by making the convex union of several connected components of b until there are fewer connected components nents than in a, and fewer than five connected components
- $\bigtriangledown_{D^{\sharp}}$  is a widening <sup>12</sup>

<sup>&</sup>lt;sup>12</sup> along the abstract iterates the number of connected components decreases until it reaches 1, and the interval [0; 1] is the only element with one connected component.

- The sequence:

$$egin{cases} u_0 = \{0;1\},\ u_{2n} = u_{2n-1} 
abla_{D^{\sharp}} f(u_{2n-1}),\ u_{2n+1} = u_{2n} \cup f(u_{2n}) \end{cases}$$

is 
$$u_{2n} = \{0\} \cup [\frac{1}{2^{2n}}; 1]$$
 and  $u_{2n+1} = \{0; \frac{1}{2^{2n+1}}\} \cup [\frac{1}{2^{2n}}; 1].$   
- Whence it is not ultimately stationary.

## Reducing widenings

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#### Problem with the reduction of widenings

- -Let  $\nabla_1$  be a widening on an abstract domain  $D_1$
- Let  $\nabla_2$  be a widening on an abstract domain  $D_2$
- $abla_1 imes 
  abla_2$  is a widening on the product  $D_1 imes D_2^{-13}$
- However,  $\nabla_1 \times \nabla_2$  may no longer ensure termination of the analysis in case of interdomain reductions

<sup>13</sup> interpreted as a conjunction in the concrete

#### Counter-example

{ A: [100, 100], X: [0,0], Y: [0, +oo] }  
while 
$$(X < Y)$$
 {  $X = X + 1$  }  
 $[0,0] \cup ((X \cap [-\infty, \max(Y)]) + [1,1]) \subseteq X$  inequation  $F(X) \subseteq X$   
 $X_0 = \bot$ ,  $X_n = X_{n-1} \bigtriangledown F(X_{n-1})$  until  $F(X_n) \subseteq X_n$ 

Iterates with widening and no reduction:

$$egin{aligned} X &= ot \ X &= ot 
ot \ X &= ot 
ot 
ot \ [0,0] = [0,0] \ X &= [0,0] ot \ [0,1] = [0,+\infty] \ X &= [0,+\infty] ot \ [0,+\infty] = [0,+\infty] \ ext{stable} \end{aligned}$$

#### Widening always enforces termination

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{ A: [100, 100], X: [0,0], Y: [0, +oo] } while  $(X < Y) \{ X = X + 1 \}$  $[0,0] \cup ((X \cap [-\infty, \max(Y)]) + [1,1]) \subseteq X$  inequation  $F(X) \subseteq X$ Iterates with widening and reduction by  $X \leq A$ :  $X = \bot$  $X = \perp \bigtriangledown [0,0] = [0,0]$  $X = [0,0] \bigtriangledown [0,1] = [0,+\infty]$  $X \rightarrow [0, 99]$ reduction by octagons  $X = [0, 99] \bigtriangledown [0, 100] = [0, +\infty]$ unstable  $[0, +\infty] \not\subseteq [0, 99]$  $X \rightarrow [0,99]$ reduction by octagons  $X = [0, 99] \bigtriangledown [0, 100] = [0, +\infty]$ unstable  $[0, +\infty] \not\subset [0, 99]$ 

Widening no longer enforces termination because of reductions

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Convergence enforcement with delayed and reduced widenings

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#### Abstract domains hierarchy

– The analysis is performed using a finite product

 $D^{\sharp} = \prod_{i \in I} D^{\sharp}_i$ 

of totally ordered abstract domains  $(D_i^{\sharp}, \subseteq_i^{\sharp})_{i \in I}$ 

- Each  $D_i^{\sharp}$  has a widening operator  $\nabla_i$
- The infimum is  $\bot = (\bot_i)_{i \in I}$
- Let  $\mathbf{F}_{D^{\sharp}} \in D^{\sharp} \to D^{\sharp}$  be the fixpoint transformer

 $<sup>^{14}</sup>$  A domain is larger than its underlying domains.

### Strengthened definition of widenings

Each  $\nabla_i$  on  $D_i^{\sharp}$  is such that:

- for any  $a, b \in D_i^{\sharp}$ , we have both  $a \sqsubseteq_i^{\sharp} a \bigtriangledown_i b$  and  $b \sqsubseteq_i^{\sharp} a \bigtriangledown_i b$ - Define the relation  $\rightarrow_i^{\prime} {}^{15}$  as

"for any  $a, d \in D_i^{\sharp}$ ,  $a \to_i d$  if and only if there exist  $b, c \in D_i^{\sharp}$  such that  $a \sqsubseteq_i^{\sharp} b$  and  $d = b \bigtriangledown_i c$ "  $- \to_i'$  is well-founded.

 $<sup>^{15}</sup>$  read  $a \rightarrow_i d$  as "a can be widened to d"

#### Iterates with widenings

- -Let  $((b_i)_n) \in (\{false; true\}^I)^{\mathbb{N}}$  be a family of booleans such that  $\forall i \in I$ , the sequence  $((b_i)_n)_{n \in \mathbb{N}}$  takes the value *true* an unbounded number of times.
- -Let  $(\rho_i)_{i\in I} \in D^{\sharp}$  be a finite family of abstract elements.
- Then, the sequence:

$$egin{cases} \left\{egin{aligned} (w_i)_0 = ot_i, \ u_{n+1} = \mathrm{F}_{D^{\sharp}}(w_n), \ (v_i)_{n+1} = \left\{egin{aligned} \max_{\sqsubseteq_i^{\sharp}}((w_i)_n, (u_i)_{n+1}) & ext{whenever } (b_i)_n = false, \ (w_i)_n 
abla_i(u_i)_{n+1} & ext{otherwise }, \ (w_i)_{n+1} = \mathrm{m} \ \mathrm{n}_{\sqsubseteq_i^{\sharp}}((v_i)_{n+1}, 
ho_i), \end{array}
ight.$$

#### is ultimately stationary (and sound).

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#### Convergence of the analysis

- To avoid cyclic reductions between components of the product domain: after a widening step, a domain can only refine its underlying domains.
- The abstract iterates in the abstract domains that are at the top of the hierarchy are ultimately stationary.
- Once the abstract properties in the domains that are above one domain are stable, the reduction of abstract properties in this domain can be seen as an intersection with a constant abstract property.
- Thus, its abstract iterates are ultimately stationary.

# Conclusion

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#### The power of widenings

- Infinite abstractions with widenings are provably superior to finite abstractions
- The precision of widenings can be improved by fairly delaying its applications and reducing its extrapolations (while still ensuring convergence)
- The abstract domains can be organized in hierarchical networks to minimize programming efforts when introducing new abstractions and reductions in the static analyzer

# THE END, THANK YOU



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#### Presentation based on:

[1] P. Cousot, R. Cousot, J. Feret, L. Mauborgne, A. Miné, D. Monniaux, & X. Rival. Combination of Abstractions in the ASTRÉE Static Analyzer. In 11th Annual Asian Computing Science Conference (ASIAN'06), National Center of Sciences, Tokyo, Japan, December 6-8, 2006. LNCS, Springer (to appear).

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