

Extracting a Data Flow Analyser in Constructive Logic

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Static program analysis

The goals of static program analysis

- ▶ To prove properties about the run-time behaviour of a program
- ▶ In a fully automatic way
- ▶ Without actually executing this program

Static program analysis

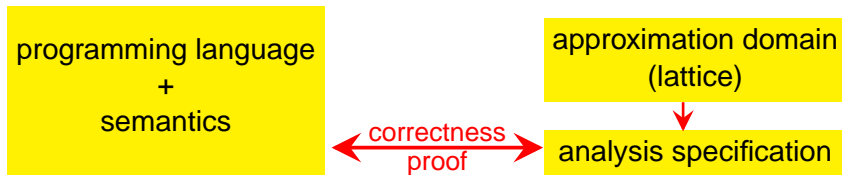
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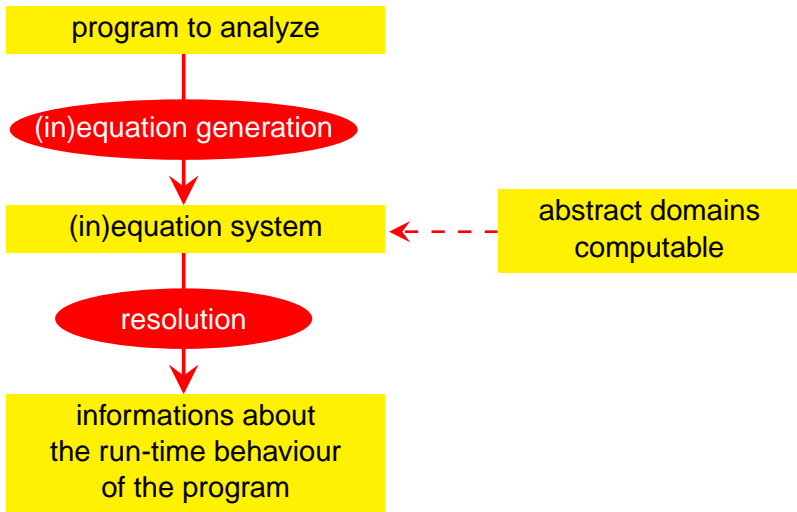
Solid foundations for designing an analyser

- ▶ Formalization and correctness proof by abstract interpretation
- ▶ Resolution of constraints on lattices by iteration and symbolic computation

Formalization



Resolution



So what's the problem ?

Formalization part

$$\begin{aligned}
 & \hat{\alpha}[P](\text{Post}[\mathbf{if} B \text{ then } S_1 \text{ else } S_2 \mathbf{fi}]) \\
 = & \quad \{\text{def. (110) of } \hat{\alpha}[P]\} \\
 & \hat{\alpha}[P] \circ \text{Post}[\mathbf{if} B \text{ then } S_1 \text{ else } S_2 \mathbf{fi}] \circ \check{y}[P] \\
 = & \quad \{\text{def. (103) of Post}\} \\
 & \hat{\alpha}[P] \circ \text{post}[\tau^*[\mathbf{if} B \text{ then } S_1 \text{ else } S_2 \mathbf{fi}] \circ \check{y}[P]] \\
 = & \quad \{\text{big step operational semantics (93)}\} \\
 & \hat{\alpha}[P] \circ \text{post}[(1_{\Sigma[P]} \cup \tau^{\hat{B}}) \circ \tau^*[S_1] \circ (1_{\Sigma[P]} \cup \tau^{\hat{C}}) \cup (1_{\Sigma[P]} \cup \tau^{\hat{B}}) \circ \tau^*[S_2] \circ (1_{\Sigma[P]} \cup \tau^{\hat{C}})] \\
 & \quad \circ \check{y}[P] \\
 = & \quad \{\text{Galois connection (98) so that post preserves joins}\} \\
 & \hat{\alpha}[P] \circ (\text{post}[(1_{\Sigma[P]} \cup \tau^{\hat{B}}) \circ \tau^*[S_1] \circ (1_{\Sigma[P]} \cup \tau^{\hat{C}})] \dot{\cup} \\
 & \quad \text{post}[(1_{\Sigma[P]} \cup \tau^{\hat{B}}) \circ \tau^*[S_2] \circ (1_{\Sigma[P]} \cup \tau^{\hat{C}})]) \circ \check{y}[P] \\
 = & \quad \{\text{Galois connection (106) so that } \hat{\alpha}[P] \text{ preserves joins}\} \\
 & (\hat{\alpha}[P] \circ \text{post}[(1_{\Sigma[P]} \cup \tau^{\hat{B}}) \circ \tau^*[S_1] \circ (1_{\Sigma[P]} \cup \tau^{\hat{C}})] \circ \check{y}[P]) \hat{\cup} (\hat{\alpha}[P] \circ \\
 & \quad \text{post}[(1_{\Sigma[P]} \cup \tau^{\hat{B}}) \circ \tau^*[S_2] \circ (1_{\Sigma[P]} \cup \tau^{\hat{C}})] \circ \check{y}[P]) \\
 \stackrel{\hat{\cup}}{=} & \quad \{\text{lemma (5.3) and similar one for the else branch}\} \\
 \lambda J \cdot \text{let } J' = \lambda l \in \text{in}_P[P] \cdot (l = \text{at}_P[S_1] ? J_{\text{at}_P[S_1]} \dot{\cup} \text{Abexp}[B](J_l) \dot{\&} J_l) \text{ in} & \quad (120) \\
 & \quad \text{let } J'' = \text{APost}[S_1](J') \text{ in} \\
 & \quad \lambda l \in \text{in}_P[P] \cdot (l = l' ? J_{l'}'' \dot{\cup} J_{\text{after}_P[S_1]}'' \dot{\&} J_l''') \\
 \dot{\cup} & \\
 & \quad \text{let } J'' = \lambda l \in \text{in}_P[P] \cdot (l = \text{at}_P[S_2] ? J_{\text{at}_P[S_2]} \dot{\cup} \text{Abexp}[T(\neg B)](J_l) \dot{\&} J_l) \text{ in} \\
 & \quad \text{let } J''' = \text{APost}[S_2](J'') \text{ in} \\
 & \quad \lambda l \in \text{in}_P[P] \cdot (l = l' ? J_{l'}''' \dot{\cup} J_{\text{after}_P[S_2]}''' \dot{\&} J_l''') \\
 = & \quad \{\text{by grouping similar terms}\} \\
 \lambda J \cdot \text{let } J' = \lambda l \in \text{in}_P[P] \cdot (l = \text{at}_P[S_1] ? J_{\text{at}_P[S_1]} \dot{\cup} \text{Abexp}[B](J_l) \dot{\&} J_l) & \\
 \text{and } J'' = \lambda l \in \text{in}_P[P] \cdot (l = \text{at}_P[S_2] ? J_{\text{at}_P[S_2]} \dot{\cup} \text{Abexp}[T(\neg B)](J_l) \dot{\&} J_l) \text{ in} & \\
 & \quad \text{let } J'' = \text{APost}[S_1](J') \\
 & \quad \text{and } J''' = \text{APost}[S_2](J'') \text{ in} \\
 & \quad \lambda l \in \text{in}_P[P] \cdot (l = l' ? J_{l'}'' \dot{\cup} J_{\text{after}_P[S_1]}'' \dot{\cup} J_{l'}''' \dot{\cup} J_{\text{after}_P[S_2]}''' \dot{\&} J_l''') \\
 = & \quad \{\text{by locality (113) and labelling scheme (59) so that in particular } J_{l'}'' = J_{l'}''' = J_{l'}'' \dot{\cup} J_{l'}'''\} \\
 & = J_{l'}'' \dot{\cup} J_{l'}''' \text{ and } \text{APost}[S_1] \text{ and } \text{APost}[S_2] \text{ do not interfere}\}
 \end{aligned}$$

Formalization part

$$\begin{aligned}
 & \ddot{\alpha}[P](\text{Post}[\mathbf{if} B \text{ then } S_1 \text{ else } S_2 \ \mathbf{fi}]) \\
 = & \quad \{\text{def. (110) of } \ddot{\alpha}[P]\} \\
 & \ddot{\alpha}[P] \circ \text{Post}[\mathbf{if} B \text{ then } S_1 \text{ else } S_2 \ \mathbf{fi}] \circ \check{y}[P] \\
 = & \quad \{\text{def. (103) of Post}\} \\
 & \ddot{\alpha}[P] \circ \text{post}[\tau^*[\mathbf{if} B \text{ then } S_1 \text{ else } S_2 \ \mathbf{fi}] \circ \check{y}[P]] \\
 = & \quad \{\text{big step operational semantics (93)}\} \\
 & \ddot{\alpha}[P] \circ \text{post}[(1_{\Sigma[P]} \cup \tau^{\hat{B}}) \circ \tau^*[S_1] \circ (1_{\Sigma[P]} \cup \tau^{\hat{C}}) \cup (1_{\Sigma[P]} \cup \tau^{\hat{B}}) \circ \tau^*[S_2] \circ (1_{\Sigma[P]} \cup \tau^{\hat{C}}) \cup \check{y}[P]] \\
 = & \quad \{\text{Galois connection (98) so that post preserves joins}\} \\
 & \ddot{\alpha}[P] \circ (\text{post}[(1_{\Sigma[P]} \cup \tau^{\hat{B}}) \circ \tau^*[S_1] \circ (1_{\Sigma[P]} \cup \tau^{\hat{C}})] \dot{\cup} \\
 & \text{post}[(1_{\Sigma[P]} \cup \tau^{\hat{B}}) \circ \tau^*[S_2] \circ (1_{\Sigma[P]} \cup \tau^{\hat{C}})]) \circ \check{y}[P] \\
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 \stackrel{\ddot{\alpha}}{=} & \quad \{\text{lemma (5.3) and similar one for the else branch}\} \\
 \lambda J. \text{let } J' = \lambda l \in \text{in}_F[P].(l = \text{at}_F[S_1] ? J_{\text{at}_F[S_1]} \dot{\cup} \text{Abexp}[B](J_l) \dot{\&} J_l) \text{ in} & \quad (120) \\
 & \quad \text{let } J'' = \text{APost}[S_1](J') \text{ in} \\
 & \quad \lambda l \in \text{in}_F[P].(l = l' ? J''_{l'} \dot{\cup} J''_{\text{after}_F[S_1]} \dot{\&} J''_{l'}) \\
 \dot{\cup} & \\
 & \text{let } J' = \lambda l \in \text{in}_F[P].(l = \text{at}_F[S_2] ? J_{\text{at}_F[S_2]} \dot{\cup} \text{Abexp}[T(\neg B)](J_l) \dot{\&} J_l) \text{ in} \\
 & \quad \text{let } J'' = \text{APost}[S_2](J') \text{ in} \\
 & \quad \lambda l \in \text{in}_F[P].(l = l' ? J''_{l'} \dot{\cup} J''_{\text{after}_F[S_2]} \dot{\&} J''_{l'}) \\
 = & \quad \{\text{by grouping similar terms}\} \\
 \lambda J. \text{let } J' = \lambda l \in \text{in}_F[P].(l = \text{at}_F[S_1] ? J_{\text{at}_F[S_1]} \dot{\cup} \text{Abexp}[B](J_l) \dot{\&} J_l) & \\
 \text{and } J' = \lambda l \in \text{in}_F[P].(l = \text{at}_F[S_2] ? J_{\text{at}_F[S_2]} \dot{\cup} \text{Abexp}[T(\neg B)](J_l) \dot{\&} J_l) & \\
 \text{let } J'' = \text{APost}[S_1](J') & \\
 \text{and } J'' = \text{APost}[S_2](J') \text{ in} & \\
 \lambda l \in \text{in}_F[P].(l = l' ? J''_{l'} \dot{\cup} J''_{\text{after}_F[S_1]} \dot{\cup} J''_{\text{after}_F[S_2]} \dot{\&} J''_{l'} \dot{\cup} J''_{l'}) & \\
 = & \quad \{\text{by locality (113) and labelling scheme (59) so that in particular } J''_{l'} = J''_{l'} = J''_{l'} = J''_{l'} \\
 = J''_{l'} = J''_{l'} \text{ and APost}[S_1] \text{ and APost}[S_2] \text{ do not interfere}\} &
 \end{aligned}$$

Implementation part

```

int main(int argc, char **argv)
{
  int i, j, t, parent_a, parent_b;
  int **swap, **newpop, **oldpop;
  double *fit, *normfit;

  get_options(argc, argv, options, help_string);
  random(seed);
  read_specs(specs);
  size += (size / 2 * 2 != size);
  newpop = xmalloc(sizeof(int *) * size);
  oldpop = xmalloc(sizeof(int *) * size);
  fit = xmalloc(sizeof(double) * size);
  normfit = xmalloc(sizeof(double) * size);
  for(i = 0; i < size; i++) {
    newpop[i] = xmalloc(sizeof(int) * len);
    oldpop[i] = xmalloc(sizeof(int) * len);
    for(j = 0; j < len * 2; j++)
      random_solution(oldpop[i]);
  }
  for(t = 0; t < gens; t++) {
    compute_fitness(oldpop, fit, normfit);
    dump_stats(t, oldpop, fit);
    for(i = 0; i < size; i += 2) {
      parent_a = select_one(normfit);
      parent_b = select_one(normfit);
      reproduce(oldpop, newpop, parent_a, parent_b, i);
    }
    swap = newpop; newpop = oldpop; oldpop = swap;
  }
  exit(0);
}

```


Formalization part

$\hat{\alpha}[P] \circ (\text{Post}[\text{if } B \text{ then } S_1 \text{ else } S_2 \text{ fi}])$
 = {def. (110) of $\hat{\alpha}[P]$ }
 $\hat{\alpha}[P] \circ \text{Post}[\text{if } B \text{ then } S_1 \text{ else } S_2 \text{ fi}] \circ \check{\gamma}[P]$
 = {def. (103) of Post}
 $\hat{\alpha}[P] \circ \text{post}[\tau^*[\text{if } B \text{ then } S_1 \text{ else } S_2 \text{ fi}] \circ \check{\gamma}[P]]$
 = {big step operational semantics (93)}
 $\hat{\alpha}[P] \circ \text{post}[(1_{\Sigma}[P] \cup \tau^B) \circ \tau^*[S_1] \cup (1_{\Sigma}[P] \cup \tau^B) \cup (1_{\Sigma}[P] \cup \tau^B) \circ \tau^*[S_2] \cup (1_{\Sigma}[P] \cup \tau^B)]$
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Do both parts talk about the same ?

$\lambda J. \text{let } J' = \lambda l \in \text{in}_P[P]. (l = \text{at}_P[S_1] ? J_{\text{at}_P[S_1]} \dot{\cup} \text{Abexp}[B](J_l) \dot{\&} J_l) \text{ in} \quad (120)$
 $\text{let } J'' = \text{APost}[S_1](J')$
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 $\dot{\cup}$
 $\text{let } J'' = \lambda l \in \text{in}_P[P]. (l = \text{at}_P[S_2] ? J_{\text{at}_P[S_2]} \dot{\cup} \text{Abexp}[\neg B](J_l) \dot{\&} J_l) \text{ in}$
 $\text{let } J'' = \text{APost}[S_2](J'')$
 $\lambda l \in \text{in}_P[P]. (l = l' ? J_{l'}'' \dot{\cup} J_{\text{after}_P[S_2]}'' \dot{\&} J_{l'}'')$
 = {by grouping similar terms}
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 $\text{let } J'' = \text{APost}[S_1](J')$
 $\text{and } J'' = \text{APost}[S_2](J'') \text{ in}$
 $\lambda l \in \text{in}_P[P]. (l = l' ? J_{l'}'' \dot{\cup} J_{\text{after}_P[S_1]}'' \dot{\cup} J_{l'}'' \dot{\cup} J_{\text{after}_P[S_2]}'' \dot{\&} J_{l'}'' \dot{\cup} J_{l'}'')$
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    int **swap, **newpop, **oldpop;
    double *fit, *normfit;

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    read_specs(specs);
    size += (size / 2 * 2 != size);
    newpop = xmalloc(sizeof(int *) * size);

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        reproduce(oldpop, newpop, parent_a, parent_b, i);
    }
    swap = newpop; newpop = oldpop; oldpop = swap;
}
exit(0);
  
```

Static Analysis for real-life languages

Example of real-life language : bytecode JavaCard

- ▶ 180 instructions
- ▶ Real need of static analysis to verify properties about security, memory management, ...

For this kind of languages,

- ▶ Abstract domains can be complex
- ▶ Correctness proofs become long and tiresome
- ▶ Implementation and maintenance of the analyser become a software engineering task

In this work

We propose a technique based on the Coq proof assistant

- ▶ To specify a static analysis,
- ▶ To prove its correctness wrt. the semantics of the language,
- ▶ To extract a static analyser from the proof of existence of a correct program analysis result

Program-as-proofs paradigm:

Write a function f which verifies a specification P \iff Make a constructive proof of $\forall x, \exists y, P(x, y)$
 $\forall x, P(x, f(x))$

Outline

- ▶ Motivation
- ▶ A Static Analysis for Carmel
- ▶ Building a certified static analyser
- ▶ Conclusion

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Case study : a static analysis for Carmel

We follow the analysis proposed by René Rydhof Hansen¹

- ▶ Carmel : an intermediate representation of Java Card byte code
- ▶ Construction of a certified data flow analyser for Carmel

¹René Rydhof Hansen. Flow Logic for Carmel. SECSAFE-IMM-001, 2002

Syntax of Carmel

Instruction ::=

`nop`

`push c`

`pop`

`numop op`

`load x`

`store x`

`if pc`

`goto pc`

`new cl`

`putfield f`

`getfield f`

`invokevirtual mid`

`return`

} stack manipulation

} local variables manipulation

} jump

} heap manipulation

} method call and return

Semantic domains

Val	::=	num n	$n \in \mathbb{N}$
		ref r	$r \in \text{Reference}$
		null	
Stack	=	Val*	
LocalVar	=	Var \rightarrow Val	
Frame	=	PointProg \times NameMethod	
			\times LocalVar \times Stack
CallStack	=	Frame*	
Object	=	FieldName \rightarrow Val	
Heap	=	Reference \rightarrow Object _{\perp}	
State	=	Heap \times CallStack	

Example :

$$(H, \langle m, pc, L, v :: S \rangle :: SF)$$

Dynamic semantics

Operational semantics with rules like

$$\frac{\text{instructionAt}_P(m, pc) = \text{push } c}{(H, \langle m, pc, L, S \rangle :: SF) \Rightarrow (H, \langle m, pc + 1, L, c :: S \rangle :: SF)}$$

$$\frac{\begin{array}{l} \text{instructionAt}_P(m, pc) = \text{invokevirtual } m_{id} \\ m' = \text{methodLookup}(m_{id}, h(loc)) \\ f' = \langle m', 1, V, \varepsilon \rangle \\ f'' = \langle m, pc, l, s \rangle \end{array}}{(h, \langle m, pc, l, loc :: V :: s \rangle :: sf) \Rightarrow (h, f' :: f'' :: sf)}$$

A Static Analysis for Carmel

We want to calculate an approximation $(\widehat{H}, \widehat{L}, \widehat{S})$ on the domain

$$\widehat{\text{State}} = \widehat{\text{Heap}} \times \left(\text{NameMethod} \times \text{PointProg} \rightarrow \widehat{\text{LocalVar}} \right) \\ \times \left(\text{NameMethod} \times \text{PointProg} \rightarrow \widehat{\text{Stack}} \right)$$

- ▶ An approximation for all reachable heaps
- ▶ For each program points, an approximation of the operand stack and the local variables
- ▶ An object is abstracted to its class
- ▶ Numeric values are abstracted using Killdall's Constant Propagation domain

Analysis specification

Each instruction impose constraints on $(\hat{H}, \hat{L}, \hat{S})$.

Example

0: push 1

1: push 2

2: store 0

3: load 0

4: numop mult

5: goto 1



Analysis specification

Each instruction impose constraints on $(\hat{H}, \hat{L}, \hat{S})$.

Example

0: push 1

$$\hat{nil} \sqsubseteq \hat{S}(m, 0)$$

$$\top \sqsubseteq \hat{L}(m, 0)$$

1: push 2

2: store 0

3: load 0

4: numop mult

5: goto 1

Analysis specification

Each instruction impose constraints on $(\hat{H}, \hat{L}, \hat{S})$.

Example

0: push 1

$$\widehat{\text{nil}} \sqsubseteq \hat{S}(m, 0)$$

$$\top \sqsubseteq \hat{L}(m, 0)$$

1: push 2

$$\widehat{\text{push}}(\hat{1}, \hat{S}(m, 0)) \sqsubseteq \hat{S}(m, 1)$$

$$\hat{L}(m, 0) \sqsubseteq \hat{L}(m, 1)$$

2: store 0

3: load 0

4: numop mult

5: goto 1

Analysis specification

Each instruction impose constraints on $(\hat{H}, \hat{L}, \hat{S})$.

Example

0: push 1	$\widehat{\text{nil}} \sqsubseteq \hat{S}(m, 0)$	$\top \sqsubseteq \hat{L}(m, 0)$
1: push 2	$\widehat{\text{push}}(\hat{1}, \hat{S}(m, 0)) \sqsubseteq \hat{S}(m, 1)$	$\hat{L}(m, 0) \sqsubseteq \hat{L}(m, 1)$
2: store 0	$\widehat{\text{push}}(\hat{2}, \hat{S}(m, 1)) \sqsubseteq \hat{S}(m, 2)$	$\hat{L}(m, 1) \sqsubseteq \hat{L}(m, 2)$
3: load 0	$\widehat{\text{pop}}(\hat{S}(m, 2)) \sqsubseteq \hat{S}(m, 3)$	$\hat{L}(m, 2)[0 \mapsto \widehat{\text{top}}(\hat{S}(m, 2))] \sqsubseteq \hat{L}(m, 3)$
4: numop mult	$\widehat{\text{push}}(\hat{L}(m, 3)[0], \hat{S}(m, 3)) \sqsubseteq \hat{S}(m, 4)$	$\hat{L}(m, 3) \sqsubseteq \hat{L}(m, 4)$
5: goto 1	...	$\hat{L}(m, 4) \sqsubseteq \hat{L}(m, 5)$
	$\hat{S}(m, 5) \sqsubseteq \hat{S}(m, 1)$	$\hat{L}(m, 5) \sqsubseteq \hat{L}(m, 1)$

Analysis solution

The smallest value which verifies all constraints.

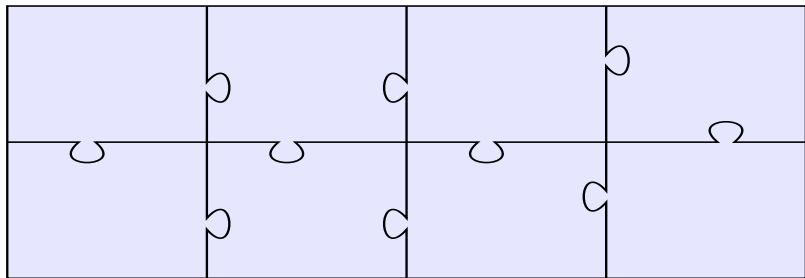
Example

0: push 1	$\widehat{\text{nil}}$	$[0 \mapsto \top; 1 \mapsto \top]$
1: push 2	$\langle \widehat{2} \rangle$	$[0 \mapsto \widehat{1}; 1 \mapsto \top]$
2: store 0	$\langle \widehat{1} :: \widehat{2} \rangle$	$[0 \mapsto \widehat{1}; 1 \mapsto \top]$
3: load 0	$\langle \widehat{2} \rangle$	$[0 \mapsto \widehat{1}; 1 \mapsto \top]$
4: numop mult	$\langle \widehat{1} :: \widehat{2} \rangle$	$[0 \mapsto \widehat{1}; 1 \mapsto \top]$
5: goto 1	\perp	\perp

Outline

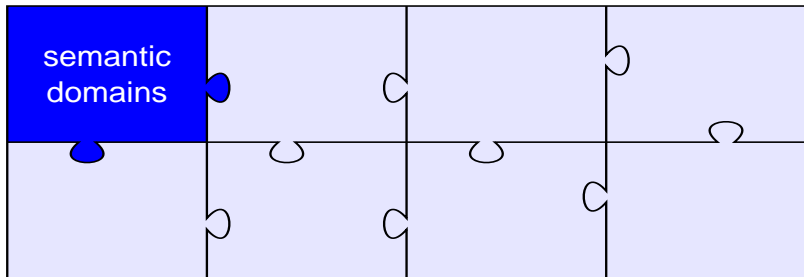
- ▶ Motivation
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Building a certified static analyser



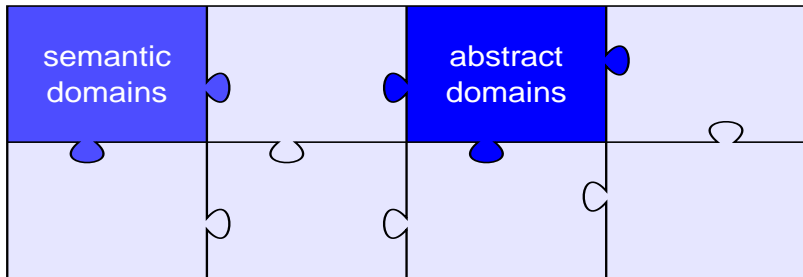
- ▶ A puzzle with 8 pieces,
- ▶ Each piece interacts with its neighbors

Building a certified static analyser



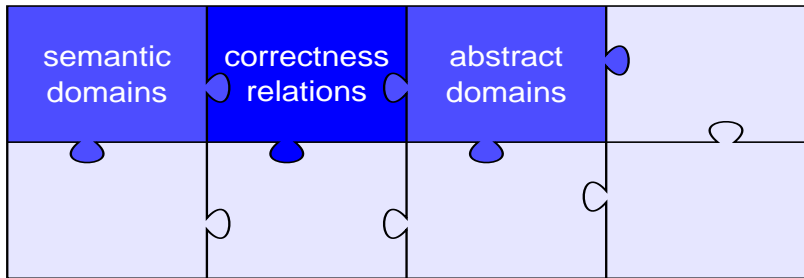
- ▶ Each semantic domain is modeled with a type
- ▶ Following exactly the definitions already seen in a previous slide

Building a certified static analyser



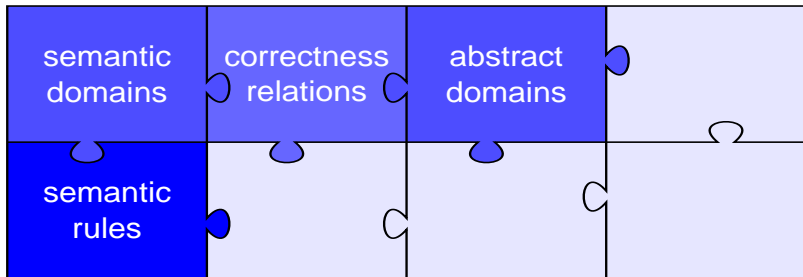
- ▶ Each semantic domain is in relation with an abstract domain
- ▶ an abstract domain is a lattice (formalization of lattices in Coq to follow...)

Building a certified static analyser



- ▶ A relation \sim between State and $\widehat{\text{State}}$
- ▶ $s \sim \widehat{\Sigma}$ interprets as “ $\widehat{\Sigma}$ is a correct approximation of s ”
- ▶ \sim must be monotone :
 $\forall s \in \text{State}, \forall \widehat{\Sigma}_1, \widehat{\Sigma}_2 \in \widehat{\text{State}},$
if $s \sim \widehat{\Sigma}_1$ and $\widehat{\Sigma}_1 \sqsubseteq \widehat{\Sigma}_2$ then $s \sim \widehat{\Sigma}_2$

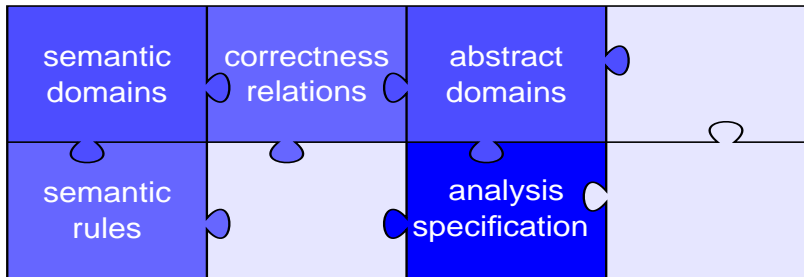
Building a certified static analyser



- ▶ The transition relation $\cdot \Rightarrow \cdot$ is defined using Coq inductive types
- ▶ Collecting semantics :
$$[P] = \{s \mid \exists s_0 \text{ an initial state, with } s_0 \Rightarrow^* s\}$$

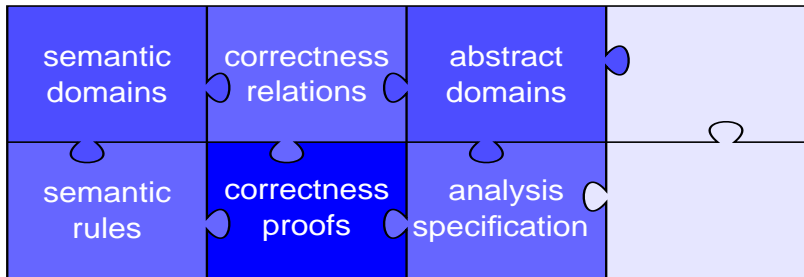
We want to compute a correct approximation of $[P]$

Building a certified static analyser



- ▶ we define a predicate $P \vdash \hat{\Sigma}$ which imposes a set of constraints on an abstract state $\hat{\Sigma}$

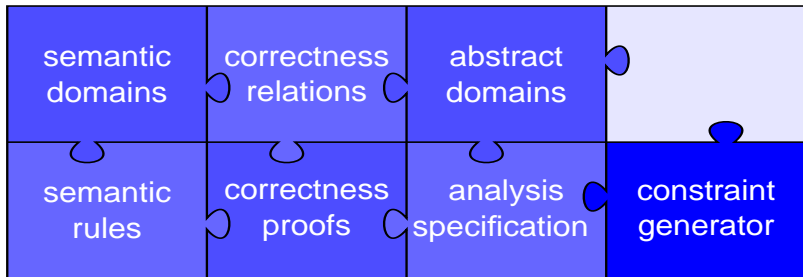
Building a certified static analyser



$$\forall P : \text{Program}, \forall \widehat{\Sigma} : \widehat{\text{State}}, \quad P \vdash \widehat{\Sigma} \Rightarrow [P] \sim \widehat{\Sigma}$$

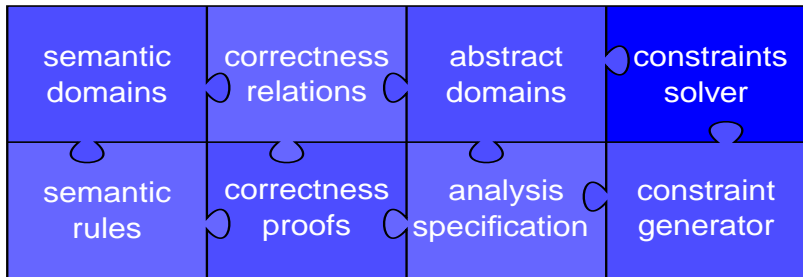
- ▶ One case by instruction
- ▶ With a special treatment for the `invokevirtual`/`return` instructions

Building a certified static analyser



- ▶ Collects all constraint of a given program

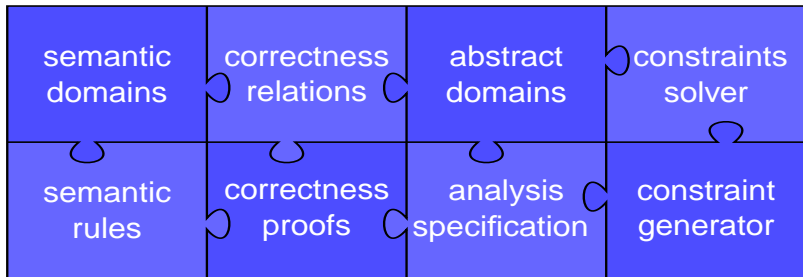
Building a certified static analyser



$\forall P : \text{Program}, \exists \widehat{\Sigma} : \widehat{\text{State}}, P \vdash \widehat{\Sigma}$

- ▶ In fact, a stronger result : there exists a smallest solution

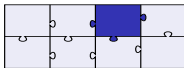
Building a certified static analyser



Final result

$$\left. \begin{array}{l} \forall P, \forall \hat{\Sigma}, P \vdash \hat{\Sigma} \Rightarrow [P] \sim \hat{\Sigma} \\ \forall P, \exists \hat{\Sigma}, P \vdash \hat{\Sigma} \end{array} \right\} \forall P, \exists \hat{\Sigma}, [P] \sim \hat{\Sigma}$$

Abstract domains



The lattice type is a big structure :

```
Record Lattice [A:Set] : Type := {  
  eq : A → A → Prop;
```

```
  order : A → A → Prop;
```

```
  join : A → A → A;
```

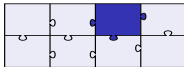
```
  eq_dec : A → A → bool;
```

```
  bottom : A;
```

```
  top : A;
```

```
  }.
```

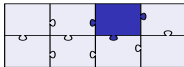
Abstract domains



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Record Lattice [A:Set] : Type := {  
  eq : A → A → Prop;  
    eq_prop : ...; // eq is an equivalence relation  
  order : A → A → Prop;  
    order_prop : ...; // order is an order relation  
  join : A → A → A;  
    join_prop : ...; // join is a correct binary least upper bound  
  eq_dec : A → A → bool;  
    eq_dec_prop : ...; // eq_dec is a correct equality test  
  bottom : A;  
    bottom_prop : ...; // bottom is the smallest element  
  top : A;  
    top_prop : ...; // top is the biggest element  
  acc_prop : ...; //  $\sqsubset$  is well founded (ascending chain condition)  
}.
```

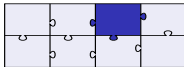
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```

A lattice library



- ▶ Two base lattices
 - ▶ Flat lattice of constants
 - ▶ Lattice of sets over a finite subset of integer
- ▶ Four functions to combine lattices
 - ▶ Product of lattice
 - ▶ Sum of lattice
 - ▶ Arrays whose elements live in a lattice and whose size is bounded (efficient functional structure)
 - ▶ List whose elements live in a lattice

This modular construction saves a considerable amount of time and effort.

```
(array (array (list (finiteSet + constants))))
```

For this analysis : \times (array (array (array (finiteSet + constants))))

```
 $\times$  (array (array (finiteSet + constants)))
```

Constraint solver



1. A generic fixed point solver

$\forall L : (\text{lattice } A), \forall f : A \rightarrow A, f \text{ monotone},$
 $\exists x : A, x \text{ is the least fixed point of } f$

proof : the sequence $\perp, f(\perp), f^2(\perp), \dots$ stabilizes on the least fixed point

2. We use it to solve the functional constraints, using the fact that

$x \text{ is the least solution of } f_1(x) \sqsubseteq x, \dots, f_n(x) \sqsubseteq x \iff x \text{ is the least fixed point of } \hat{f}_1 \circ \dots \circ \hat{f}_n$

with $\hat{f}(x) = f(x) \sqcup x$

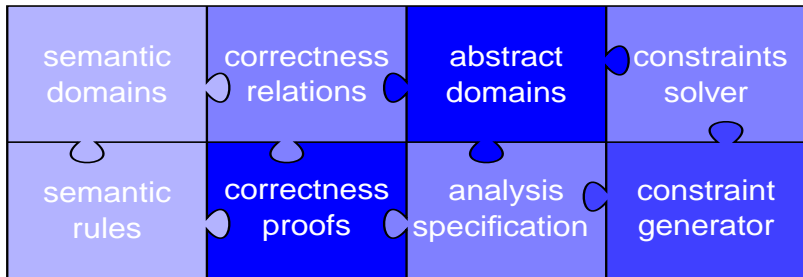
3. Combined with the constraint generator, we obtain

$$\forall P, \exists \hat{\Sigma}, P \vdash \hat{\Sigma}$$

Outline

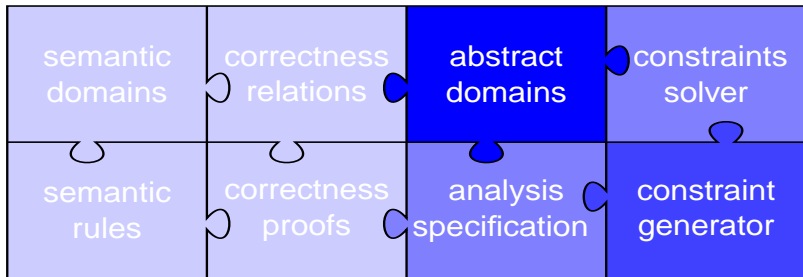
- ▶ Motivation
- ▶ A Static Analysis for Carmel
- ▶ Building a certified static analyser
- ▶ Conclusion

Where is the proof effort ?



- ▶ Most technical part in the lattice library
- ▶ Correctness part does not require specific competences in Coq
- ▶ A majority of proof is reusable to develop other analysis

Where is the programming effort ?



- ▶ The extraction mechanism only keeps the computational content of proofs
- ▶ The corresponding parts require a high attention to obtain an efficient analyser

Conclusion on the work

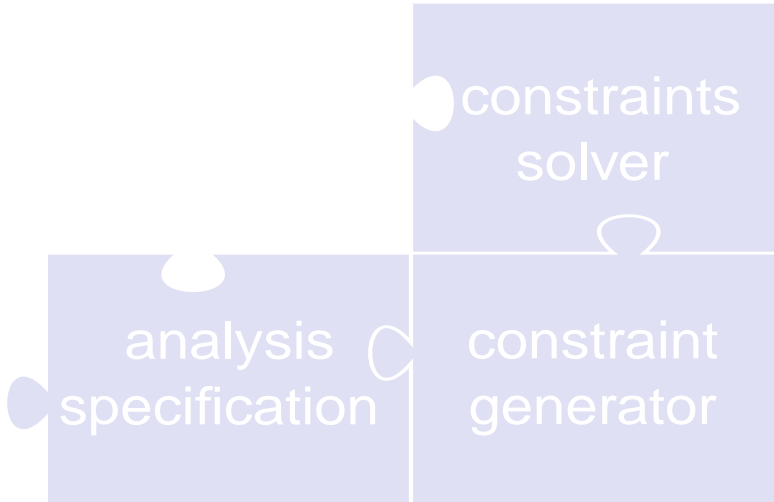
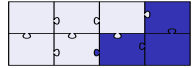
- ▶ We proposed a technique based on the Coq proof assistant
 - ▶ To develop a certified static analyser
 - ▶ To extract a correct analyser in OCaml
- ▶ We illustrated this technique with a data flow analysis for the Carmel language
 - ▶ 10000 lines of Coq converted in 2000 lines of OCaml
 - ▶ With a reasonable efficiency of the analyser :
 - ▶ About 1 minute to analyse 1000 lines of Carmel byte code

Further works

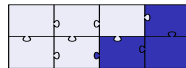
- ▶ Construction of an efficient certified work-set based program instead of the actual naive resolution
 - ▶ This program must be independent of the abstract domains
- ▶ Lattice of infinite height like intervals
- ▶ Automatization of the correctness proof ?
 - ▶ So as to quickly extend the number of language instructions
- ▶ A more extensive use of the abstract interpretation formalism
 - ▶ We must find a compromise between the reusability possibilities and the technical efforts in Coq
- ▶ Application of this technique to others languages

?

Constraint representation



Constraint representation



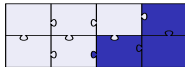
relational interpretation
(predicate on $\widehat{\text{State}}$)

- ▶ Ideal for proofs
- ▶ Extraction is compromised

constraints
solver

constraint
generator

Constraint representation



relational interpretation
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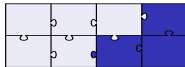
functional interpretation

$$(F(\widehat{\Sigma}) \sqsubseteq \widehat{\Sigma})$$

- ▶ Difficult to use in proofs
- ▶ Can be extracted

constraint
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Constraint representation



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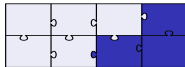
- ▶ Difficult to use in proofs
- ▶ Can be extracted

$\mathcal{F}[\cdot]$

intermediate
interpretation

$\mathcal{R}[\cdot]$

Constraint representation



+ a proof of equivalence

$$\forall c : \text{Constraints}, \forall \widehat{\Sigma} : \widehat{\text{State}}, \\ \mathcal{R}[c](\widehat{\Sigma}) \iff \mathcal{F}[c](\widehat{\Sigma}) \sqsubseteq \widehat{\Sigma}$$

functional interpretation

$$(F(\widehat{\Sigma}) \sqsubseteq \widehat{\Sigma})$$

- ▶ Difficult to use in proofs
- ▶ Can be extracted

relational interpretation
(predicate on $\widehat{\text{State}}$)

- ▶ Ideal for proofs
- ▶ Extraction is compromised

$\mathcal{F}[\cdot]$

$\mathcal{R}[\cdot]$

intermediate
interpretation

Correctness proof

$$\forall P : \text{Program}, \forall \widehat{\Sigma} : \widehat{\text{State}}, \quad P \vdash \widehat{\Sigma} \implies [P] \sim \widehat{\Sigma}$$

We prove it by well-founded induction on the length of the program execution.

Induction step:

- ▶ for all instructions I , except `return`

$$\forall P, \forall \widehat{\Sigma} : \widehat{\text{State}}, P \vdash \widehat{\Sigma} \implies$$

$$\forall s_1 : \text{State}, s_1 \sim \widehat{\Sigma} \implies$$

$$\forall s_2 : \text{State}, [s_1 \Rightarrow_I s_2] \implies s_2 \sim \widehat{\Sigma}$$

- ▶ for the `return` instruction

$$\forall P, \forall \widehat{\Sigma} : \widehat{\text{State}}, P \vdash \widehat{\Sigma} \implies$$

$$\forall s_1 : \text{State}, \left(\forall s, s \Rightarrow^* s_1 \implies s \sim \widehat{\Sigma} \right) \implies$$

$$\forall s_2 : \text{State}, [s_1 \Rightarrow_{\text{return}} s_2] \implies s_2 \sim \widehat{\Sigma}$$