

« Forward Non-relational Finitary Static Analysis, Part II »

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Course 16.399: “Abstract interpretation”

<http://web.mit.edu/afs/athena.mit.edu/course/16/16.399/www/>



A few definitions from previous lectures...

- From lecture 8, recall the *forward/bottom-up collecting semantics of arithmetic expressions*:

$$\text{Faexp} \in \text{Aexp} \mapsto \wp(\text{Env}[[P]]) \xrightarrow{\sqcup} \wp(\mathbb{I}_\Omega),$$

$$\text{Faexp}[[A]]R \stackrel{\text{def}}{=} \{v \mid \exists \rho \in R : \rho \vdash A \Rightarrow v\} \quad (1)$$

- the *collecting semantics of boolean expressions*:

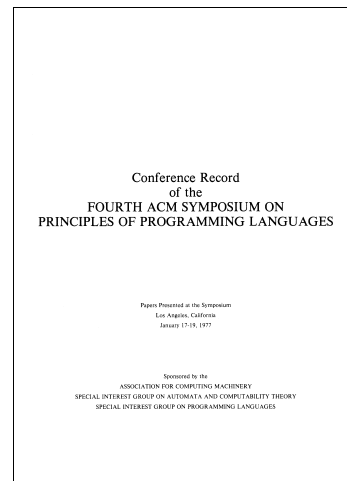
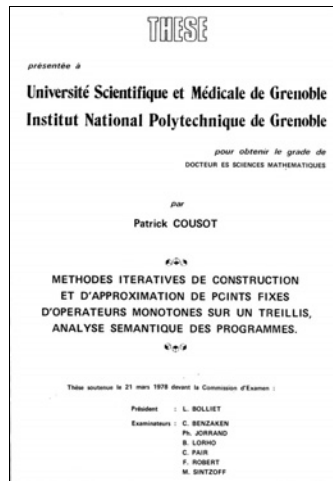
$$\text{Cbexp} \in \text{Bexp} \mapsto \wp(\mathbb{R}) \xrightarrow{\sqcup} \wp(\mathbb{R}),$$

$$\text{Cbexp}[[B]]R \stackrel{\text{def}}{=} \{\rho \in R \mid \rho \vdash B \Rightarrow \text{tt}\} \quad (2)$$

- From lecture 14, the *forward reachability collecting semantics of commands*:

$$\text{Rcom} \in \text{Com} \mapsto \wp(\text{Env}[[P]]) \xrightarrow{\sqcup} (\text{in}_P[[C]] \mapsto \wp(\text{Env}[[P]]))$$

$$\text{Rcom}[[C]]R \stackrel{\text{def}}{=} \{\rho \mid \exists \rho' \in R : \langle \text{at}_P[[C], \rho' \rangle, \langle \ell, \rho \rangle \rangle \in \tau^*[[C]]\}$$



- From lecture 16, the *generic abstraction of value properties*:

$$\langle \wp(\mathbb{I}_\Omega), \subseteq \rangle \xleftrightarrow[\alpha]{\gamma} \langle L, \sqsubseteq \rangle \quad (3)$$

- the *abstraction of environment properties*:

$$\langle \wp(\mathbb{V} \mapsto \mathbb{I}_\Omega), \subseteq \rangle \xleftrightarrow[\dot{\alpha}]{\dot{\gamma}} \langle \mathbb{V} \mapsto L, \dot{\sqsubseteq} \rangle \quad (4)$$

where

$$\dot{\alpha}(R) \stackrel{\text{def}}{=} \lambda X \in \mathbb{V}. \alpha(\{\rho(X) \mid \rho \in R\}), \quad (5)$$

$$\dot{\gamma}(r) \stackrel{\text{def}}{=} \{\rho \mid \forall X \in \mathbb{V} : \rho(X) \in \gamma(r(X))\} \quad (6)$$

- the functional *abstraction of monotonic predicate transformers*:

$$\langle \wp(\mathbb{V} \mapsto \mathbb{I}_\Omega) \xrightarrow{m} \wp(\mathbb{I}_\Omega), \dot{\subseteq} \rangle \xleftrightarrow[\dot{\alpha}^p]{\gamma^p} \langle (\mathbb{V} \mapsto L) \xrightarrow{m} L, \dot{\sqsubseteq} \rangle \quad (7)$$

where



$$\begin{aligned}\alpha^\flat(\Phi) &\stackrel{\text{def}}{=} \alpha \circ \Phi \circ \dot{\gamma}, \\ \gamma^\flat(\varphi) &\stackrel{\text{def}}{=} \gamma \circ \varphi \circ \dot{\alpha}\end{aligned}\quad (8)$$

- the *nonrelational abstraction of the forward reachability collecting semantics of commands*:

$$\begin{aligned}\langle \wp(\mathbb{R}) \xrightarrow{\text{in}_P} (\text{in}_P[\mathcal{C}] \mapsto \wp(\mathbb{R})), \dot{\subseteq} \rangle \\ \xleftrightarrow[\alpha[\mathcal{C}]]{\gamma[\mathcal{C}]} \langle (\mathbb{V} \mapsto L) \xrightarrow{\text{in}_P} (\text{in}_P[\mathcal{C}] \mapsto (\mathbb{V} \mapsto L)), \dot{\subseteq} \rangle\end{aligned}$$

where

$$\begin{aligned}\alpha[\mathcal{C}]\varphi &\stackrel{\text{def}}{=} \lambda r. \lambda \ell. \dot{\alpha}(\varphi(\dot{\gamma}(r)))(\ell) \\ \gamma[\mathcal{C}]\psi &\stackrel{\text{def}}{=} \lambda R. \lambda \ell. \dot{\gamma}(\psi(\dot{\alpha}(R)))(\ell)\end{aligned}$$



$$\text{Abexp}[B]\lambda Y. \perp \stackrel{\text{def}}{=} \lambda Y. \perp \quad \text{if } \gamma(\perp) = \emptyset \quad (12)$$

- the *generic non-relational forward reachability abstract semantics of commands*:

$$\text{Acom}[\mathcal{C}] \stackrel{\text{def}}{=} \alpha[\mathcal{C}](\text{Rcom}[\mathcal{C}]) \quad (13)$$

(14)

- From lecture 16, *basic abstract operations*

$$n^\flat = \alpha(\{n\}) \quad (15)$$

$$?^\flat \sqsupseteq \alpha(\mathbb{I}) \quad (16)$$



- From lecture 16, various generic nonrelational abstract semantics, starting from the *abstract semantics of arithmetic expressions*:

$$\text{Faexp}^\flat[A] \stackrel{\text{def}}{=} \alpha^\flat(\text{Faexp}[A]) \quad (9)$$

- the *generic nonrelational abstract semantics of boolean expressions*:

$$\text{Abexp} \in \text{Bexp} \mapsto (\mathbb{V} \mapsto L) \xrightarrow{\text{in}_P} (\mathbb{V} \mapsto L) \quad (10)$$

$$\text{Abexp}[B] \stackrel{\text{def}}{=} \dot{\alpha}(\text{Cbexp}[B]) \quad (11)$$

and for the empty set:

- From lecture 16, the *initialization and simple sign abstraction*:

$$\begin{aligned}\alpha(P) &\stackrel{\text{def}}{=} (P \subseteq \{\Omega_a\} ? \text{BOT} \\ &\quad \| P \subseteq [\text{min_int}, -1] \cup \{\Omega_a\} ? \text{NEG} \\ &\quad \| P \subseteq \{0, \Omega_a\} ? \text{ZERO} \\ &\quad \| P \subseteq [1, \text{max_int}] \cup \{\Omega_a\} ? \text{POS} \\ &\quad \| P \subseteq \mathbb{I} \cup \{\Omega_a\} ? \text{INI} \\ &\quad \| P \subseteq \{\Omega_i, \Omega_a\} ? \text{ERR} \\ &\quad \vdots \text{TOP})\end{aligned}\quad (17)$$

and *concretization*:

$$\begin{aligned}\gamma(\text{BOT}) &\stackrel{\text{def}}{=} \{\Omega_a\} & \gamma(\text{INI}) &\stackrel{\text{def}}{=} \mathbb{I} \cup \{\Omega_a\}, \\ \gamma(\text{NEG}) &\stackrel{\text{def}}{=} [\text{min_int}, -1] \cup \{\Omega_a\} & \gamma(\text{ERR}) &\stackrel{\text{def}}{=} \{\Omega_i, \Omega_a\} \\ \gamma(\text{ZERO}) &\stackrel{\text{def}}{=} \{0, \Omega_a\} & \gamma(\text{TOP}) &\stackrel{\text{def}}{=} \mathbb{I}_\Omega \\ \gamma(\text{POS}) &\stackrel{\text{def}}{=} [1, \text{max_int}] \cup \{\Omega_a\}\end{aligned}\quad (18)$$



Generic backward/bottom-up static analysis of arithmetic expressions



```
% cd Initialization-Simple-Sign % cd Initialization-Simple-Sign
% ./a.out ../Examples/example13.si% ./a.out ../Examples/example14.sil
{ y:ERR; r:ERR } { y:ERR; r:ERR }
0: 0:
  y := ?;      y := ?;
1: 1:
  if (y = 0) then  if (y = 0) then
    2: 2:
      r := 0      r := y
    3: 3:
  else {(y < 0) | (0 < y)} else {(y < 0) | (0 < y)}
    4: 4:
      r := 0      r := 0
    5: 5:
  fi  fi
6: 6:
{ y:INI; r:ZERO } { y:INI; r:INI }
```



Motivating example

- The forward/top-down static analysis of arithmetic expressions brings no information on the values of the variables appearing in the arithmetic expressions when the expected result of such expressions is known, e.g. in tests
- Example (initialization and simple sign):



- Example 13 (left) where $r = 0$ at point 6: shows that in example 14 (right), r is not known to be 0 at line 3: whence that y is not known to be 0 at line 2: whence that $(y = 0)$ brings no abstract information on y at line 1:.
- More generally, any information on the possible result of an arithmetic expression should bring information on the values of the variables involved in the arithmetic expressions for its result to satisfy the known information



Backward/bottom-up collecting semantics of arithmetic expressions

- The *backward/top-down collecting semantics* $\text{Baexp}[A](R)P$ of an arithmetic expression A defines the subset of possible environments R such that the arithmetic expression may evaluate, without producing a runtime error, to a value belonging to given set P

$$\text{Baexp} \in \text{Aexp} \mapsto \wp(\mathbb{R}) \xrightarrow{\sqcup} \wp(\mathbb{I}\Omega) \xrightarrow{\sqcup} \wp(\mathbb{R}),$$

$$\text{Baexp}[A](R)P \stackrel{\text{def}}{=} \{\rho \in R \mid \exists i \in P \cap \mathbb{I} : \rho \vdash A \Rightarrow i\} \quad (19)$$



Backward/bottom-up collecting semantics of arithmetic expressions is a lower closure operator

THEOREM. $\forall P \in \wp(\mathbb{R}) : \lambda R. \text{Baexp}[A](R)P$ is a lower closure operator ■

- PROOF.**
1. Monotone. If $R_1 \subseteq R_2$ then $\{\rho \in R_1 \mid \exists i \in P \cap \mathbb{I} : \rho \vdash A \Rightarrow i\} \subseteq \{\rho \in R_2 \mid \exists i \in P \cap \mathbb{I} : \rho \vdash A \Rightarrow i\}$ whence $\text{Baexp}[A]((R_1))P \subseteq \text{Baexp}[A]((R_2))P$
 2. Reductive. $\{\rho \in R \mid \exists i \in P \cap \mathbb{I} : \rho \vdash A \Rightarrow i\} \subseteq R$ and so $\text{Baexp}[A]((R))P \subseteq R$
 3. Idempotent. $\{\rho \in \{\rho' \in R \mid \exists i \in P \cap \mathbb{I} : \rho' \vdash A \Rightarrow i\} \mid \exists j \in P \cap \mathbb{I} : \rho \vdash A \Rightarrow j\} = \{\rho \in R \mid \exists j \in P \cap \mathbb{I} : \rho \vdash A \Rightarrow j\}$ and so $\text{Baexp}[A]((\text{Baexp}[A]((R))P))P = \text{Baexp}[A]((R))P$

□



Operational semantics of arithmetic expressions (recall)

Let us recall that:

$$\rho \vdash n \Rightarrow \underline{n} \quad \text{decimal numbers;} \quad (20)$$

$$\rho \vdash X \Rightarrow \rho(\underline{X}) \quad \text{variables;} \quad (21)$$

$$\frac{i \in \mathbb{I}}{\rho \vdash ? \Rightarrow i} \quad \text{random;} \quad (22)$$

$$\frac{\rho \vdash A \Rightarrow v}{\rho \vdash u A \Rightarrow \underline{u} v} \quad \text{unary arithmetic operations;} \quad (23)$$

$$\frac{\rho \vdash A_1 \Rightarrow v_1 \quad \rho \vdash A_2 \Rightarrow v_2}{\rho \vdash A_1 \text{ b } A_2 \Rightarrow v_1 \text{ b } v_2} \quad \text{binary arithmetic operations.} \quad (24)$$



Structural definition of the backward/bottom-up collecting semantics of arithmetic expressions

$$\text{Baexp}[n](R)P = (\underline{n} \in P \cap \mathbb{I} ? R : \emptyset) \quad (25)$$

$$\text{Baexp}[X](R)P = \{\rho \in R \mid \rho(X) \in P \cap \mathbb{I}\} \quad (26)$$

$$\text{Baexp}[?](R)P = (P \cap \mathbb{I} = \emptyset ? \emptyset : R) \quad (27)$$

$$\text{Baexp}[uA'](R)P = \text{Baexp}[A'](R)(\underline{u}_c^d(\text{Faexp}[A']R, P)) \quad (28)$$

$$\text{where } \underline{u}_c^d(Q, P) \stackrel{\text{def}}{=} \{v \in Q \mid \underline{u} v \in P \cap \mathbb{I}\}$$

$$\text{Baexp}[A_1 \text{ b } A_2](R)P = \quad (29)$$

$$\text{let } \langle P_1, P_2 \rangle = \underline{b}_c^d(\text{Faexp}[A_1]R, \text{Faexp}[A_2]R, P) \text{ in}$$

$$\text{Baexp}[A_1](R)P_1 \cap \text{Baexp}[A_2](R)P_2$$

$$\text{where } \underline{b}_c^d(P_1, P_2, P) \stackrel{\text{def}}{=} \{\langle v_1, v_2 \rangle \in P_1 \times P_2 \mid v_1 \text{ b } v_2 \in P \cap \mathbb{I}\}$$



Structural definition of the backward/bottom-up collecting semantics of arithmetic expressions

Before providing the proof, let us recall a few definitions from lectures 5 and 8:

$$\begin{aligned} \underline{u} \Omega_e &\stackrel{\text{def}}{=} \Omega_e; \\ \underline{u} i &\stackrel{\text{def}}{=} u i, & \text{if } u i \in \mathbb{I}; \\ \underline{u} i &\stackrel{\text{def}}{=} \Omega_a, & \text{if } u i \notin \mathbb{I}. \end{aligned} \quad (30)$$

$$\begin{aligned} \Omega_e \underline{b} v &\stackrel{\text{def}}{=} \Omega_e; \\ i \underline{b} \Omega_e &\stackrel{\text{def}}{=} \Omega_e; \\ i_1 \underline{b} i_2 &\stackrel{\text{def}}{=} i_1 b i_2, & \text{if } b \in \{+, -, *\} \wedge i_1 b i_2 \in \mathbb{I}; \\ i_1 \underline{b} i_2 &\stackrel{\text{def}}{=} i_1 b i_2, & \text{if } b \in \{/, \text{mod}\} \wedge i_1 \in \mathbb{I} \cap \mathbb{N} \wedge i_2 \in \mathbb{I} \cap \mathbb{N}_+ \wedge i_1 b i_2 \in \mathbb{I}; \\ i_1 \underline{b} i_2 &\stackrel{\text{def}}{=} \Omega_a, & \text{if } i_1 b i_2 \notin \mathbb{I} \vee (b \in \{/, \text{mod}\} \wedge (i_1 \notin \mathbb{I} \cap \mathbb{N} \vee i_2 \notin \mathbb{I} \cap \mathbb{N}_+)). \end{aligned} \quad (31)$$



$$\begin{aligned} &\text{--- Baexp}[\underline{u}A'](R)P \\ &\stackrel{\text{def}}{=} \{\rho \in R \mid \exists j \in P \cap \mathbb{I} : \rho \vdash \underline{u}A' \Rightarrow j\} && \{\text{by (19)}\} \\ &= \{\rho \in R \mid \exists v : \rho \vdash A' \Rightarrow v \wedge \underline{u}v \in P \cap \mathbb{I}\} && \{\text{by (23)}\} \\ &= \{\rho \in R \mid \exists i' \in \{v \mid \exists \rho' \in R : \rho' \vdash A' \Rightarrow v\} : \rho \vdash A' \Rightarrow i' \wedge \underline{u}i' \in P \cap \mathbb{I}\} && \{\text{set theory}\} \\ &= \{\rho \in R \mid \exists i' \in \text{Faexp}[A']R : \rho \vdash A' \Rightarrow i' \wedge \underline{u}i' \in P \cap \mathbb{I}\} && \{\text{by def. (1) of Faexp}[A']R \stackrel{\text{def}}{=} \{v \mid \exists \rho' \in R : \rho' \vdash A' \Rightarrow v\}\} \\ &= \{\rho \in R \mid \exists i' \in \{j \in \text{Faexp}[A']R \mid \underline{u}j \in P \cap \mathbb{I}\} : \rho \vdash A' \Rightarrow i'\} && \{\text{set theory}\} \\ &= \{\rho \in R \mid \exists i' \in \{j \in \text{Faexp}[A']R \mid \underline{u}j \in P \cap \mathbb{I}\} \cap \mathbb{I} : \rho \vdash A' \Rightarrow i'\} && \{\text{by (30)}\} \\ &= \{\rho \in R \mid \exists i' \in \mathbb{I} : \underline{u}_c^{\downarrow}(\text{Faexp}[A']R, P)\rho \vdash A' \Rightarrow i'\} && \{\text{by letting } \underline{u}_c^{\downarrow}(Q, P) \stackrel{\text{def}}{=} \{j \in Q \mid \underline{u}j \in P \cap \mathbb{I}\}\} \\ &= \text{Baexp}[A'](R)(\underline{u}_c^{\downarrow}(\text{Faexp}[A]R, P)) && \{\text{by (19)}\} \end{aligned}$$

$$\begin{aligned} &\text{--- Baexp}[A_1 b A_2](R)P \\ &\stackrel{\text{def}}{=} \{\rho \in R \mid \exists j \in P \cap \mathbb{I} : \rho \vdash A_1 b A_2 \Rightarrow j\} && \{\text{by (19)}\} \end{aligned}$$



PROOF.

$$\begin{aligned} &\text{--- Baexp}[\underline{n}](R)P \\ &\stackrel{\text{def}}{=} \{\rho \in R \mid \exists j \in P \cap \mathbb{I} : \rho \vdash \underline{n} \Rightarrow j\} && \{\text{by (19)}\} \\ &= \{\rho \in R \mid \underline{n} \in P \cap \mathbb{I}\} && \{\text{by (20)}\} \\ &= (\underline{n} \in P \cap \mathbb{I} ? R : \emptyset) \end{aligned}$$

$$\begin{aligned} &\text{--- Baexp}[X](R)P \\ &\stackrel{\text{def}}{=} \{\rho \in R \mid \exists j \in P \cap \mathbb{I} : \rho \vdash X \Rightarrow j\} && \{\text{by (19)}\} \\ &= \{\rho \in R \mid \rho(X) \in P \cap \mathbb{I}\} && \{\text{by (21)}\} \end{aligned}$$

$$\begin{aligned} &\text{--- Baexp}[?](R)P \\ &\stackrel{\text{def}}{=} \{\rho \in R \mid \exists j \in P \cap \mathbb{I} : \rho \vdash ? \Rightarrow j\} && \{\text{by (19)}\} \\ &= \{\rho \in R \mid \exists j \in P \cap \mathbb{I}\} && \{\text{by (22)}\} \\ &= (P \cap \mathbb{I} = \emptyset ? \emptyset : R) \end{aligned}$$



$$\begin{aligned} &= \{\rho \in R \mid \exists v_1, v_2 : \rho \vdash A_1 \Rightarrow v_1 \wedge \rho \vdash A_2 \Rightarrow v_2 \wedge v_1 \underline{b} v_2 \in P \cap \mathbb{I}\} && \{\text{by (24)}\} \\ &= \{\rho \in R \mid \exists v_1 \in \mathbb{I} : \exists v_2 \in \mathbb{I} : \rho \vdash A_1 \Rightarrow v_1 \wedge \rho \vdash A_2 \Rightarrow v_2 \wedge v_1 \underline{b} v_2 \in P \cap \mathbb{I}\} && \{\text{by (31)}\} \\ &= \{\rho \in R \mid \exists v_1 \in \{v'_1 \mid \exists \rho' \in R : \rho' \vdash A_1 \Rightarrow v'_1\} \cap \mathbb{I} : v_2 \in \{v'_2 \mid \exists \rho' \in R : \rho' \vdash A_2 \Rightarrow v'_2\} \cap \mathbb{I} : \rho \vdash A_1 \Rightarrow v_1 \wedge \rho \vdash A_2 \Rightarrow v_2 \wedge v_1 \underline{b} v_2 \in P \cap \mathbb{I}\} && \{\text{set theory}\} \\ &= \{\rho \in R \mid \exists v_1 \in \text{Faexp}[A_1]R \cap \mathbb{I} : v_2 \in \text{Faexp}[A_2]R \cap \mathbb{I} : \rho \vdash A_1 \Rightarrow v_1 \wedge \rho \vdash A_2 \Rightarrow v_2 \wedge v_1 \underline{b} v_2 \in P \cap \mathbb{I}\} && \{\text{by (1)}\} \\ &= \{\rho \in R \mid \exists \langle v_1, v_2 \rangle \in \{\langle v'_1, v'_2 \rangle \in \text{Faexp}[A_1]R \times \text{Faexp}[A_2]R \mid v_1 \underline{b} v_2 \in P \cap \mathbb{I}\} \cap \mathbb{I} \times \mathbb{I} : \rho \vdash A_1 \Rightarrow v_1 \wedge \rho \vdash A_2 \Rightarrow v_2\} && \{\text{set theory}\} \\ &= \{\rho \in R \mid \exists \langle v_1, v_2 \rangle \in \underline{b}_c^{\downarrow}(\text{Faexp}[A_1]R, \text{Faexp}[A_2]R, P) \cap \mathbb{I} \times \mathbb{I} : \rho \vdash A_1 \Rightarrow v_1 \wedge \rho \vdash A_2 \Rightarrow v_2\} && \{\text{by letting } \underline{b}_c^{\downarrow}(P_1, P_2, P) \stackrel{\text{def}}{=} \{\langle v'_1, v'_2 \rangle \in P_1 \times P_2 \mid v_1 \underline{b} v_2 \in P \cap \mathbb{I}\}\} \\ &= \text{let } \langle P_1, P_2 \rangle = \underline{b}_c^{\downarrow}(\text{Faexp}[A_1]R, \text{Faexp}[A_2]R, P) \text{ in } \\ &\quad \{\rho \in R \mid \exists v_1 \in P_1 \cap \mathbb{I} : \rho \vdash A_1 \Rightarrow v_1\} \cap \{\rho \in R \mid \exists v_2 \in P_2 \cap \mathbb{I} : \rho \vdash A_2 \Rightarrow v_2\} && \{\text{set theory}\} \end{aligned}$$



$= \text{let } \langle P_1, P_2 \rangle = \underline{b}_c^\triangleleft(\text{Faexp}[[A_1]]R, \text{Faexp}[[A_2]]R, P) \text{ in}$
 $\text{Baexp}[[A_1]](R)P_1 \cap \text{Baexp}[[A_2]](R)P_2$ \square

Observe that by their definitions, $\underline{u}_c^\triangleleft$ and $\underline{b}_c^\triangleleft$ are both monotonic in all their arguments.



Generic backward/bottom-up non-relational abstract semantics of arithmetic expressions

We now design the backward/bottom-up abstract semantics of arithmetic expressions

$$\text{Baexp}^\triangleleft \in \text{Aexp} \mapsto (\mathbb{V} \mapsto L) \xrightarrow{m} L \xrightarrow{m} (\mathbb{V} \mapsto L) .$$

The objective is to get an overapproximation of the backward collecting semantics (19) such that

$$\text{Baexp}^\triangleleft[[A]] \overset{\ddot{\sqsubseteq}}{\sqsupseteq} \alpha^\triangleleft(\text{Baexp}[[A]]) . \quad (33)$$



Generic backward/bottom-up non-relational abstraction of arithmetic expressions

Given an approximation (3) of value properties, we approximate environment properties by the nonrelational abstraction (4) and apply the following functional abstraction

$$\langle \wp(\mathbb{R}) \xrightarrow{m} \wp(\mathbb{I}_\Omega) \xrightarrow{m} \wp(\mathbb{R}), \underline{\ddot{\sqsubseteq}} \rangle \xleftarrow[\alpha^\triangleleft]{\gamma^\triangleleft} \langle (\mathbb{V} \mapsto L) \xrightarrow{m} L \xrightarrow{m} (\mathbb{V} \mapsto L), \underline{\ddot{\sqsubseteq}} \rangle$$

where

$$\begin{aligned} \underline{\Phi} \underline{\ddot{\sqsubseteq}} \underline{\Psi} &\stackrel{\text{def}}{=} \forall R \in \wp(\mathbb{R}) : \forall P \in \wp(\mathbb{I}_\Omega) : \underline{\Phi}(R)P \subseteq \underline{\Psi}(R)P, \\ \underline{\varphi} \underline{\ddot{\sqsubseteq}} \underline{\psi} &\stackrel{\text{def}}{=} \forall r \in \mathbb{V} \mapsto L : \forall p \in L : \underline{\varphi}(r)p \underline{\ddot{\sqsubseteq}} \underline{\psi}(r)p, \\ \alpha^\triangleleft(\underline{\Phi}) &\stackrel{\text{def}}{=} \lambda r \in \mathbb{V} \mapsto L . \lambda p \in L . \dot{\alpha}(\underline{\Phi}(\dot{\gamma}(r))\gamma(p)), \quad (32) \\ \gamma^\triangleleft(\underline{\varphi}) &\stackrel{\text{def}}{=} \lambda R \in \wp(\mathbb{R}) . \lambda P \in \wp(\mathbb{I}_\Omega) . \dot{\gamma}(\underline{\varphi}(\dot{\alpha}(R))\alpha(P)) . \end{aligned}$$



Structural definition of the generic backward/bottom-up non-relational abstract semantics of arithmetic expressions

$$\text{Baexp}^\triangleleft[[A]](\lambda Y . \perp)p \stackrel{\text{def}}{=} \lambda Y . \perp \quad \text{if } \gamma(\perp) = \emptyset \quad (34)$$

$$\text{Baexp}^\triangleleft[[n]](r)p \stackrel{\text{def}}{=} (n^\triangleleft(p) ? r : \lambda Y . \perp)$$

$$\text{Baexp}^\triangleleft[[X]](r)p \stackrel{\text{def}}{=} r[X := r(X) \sqcap p \sqcap ?]$$

$$\text{Baexp}^\triangleleft[[?]](r)p \stackrel{\text{def}}{=} (?^\triangleleft(p) ? r : \lambda Y . \perp)$$

$$\text{Baexp}^\triangleleft[[u A']](r)p \stackrel{\text{def}}{=} \text{Baexp}^\triangleleft[[A']](r)(u^\triangleleft(\text{Faexp}^\triangleright[[A']]r, p))$$

$$\text{Baexp}^\triangleleft[[A_1 \text{ b } A_2]](r)p \stackrel{\text{def}}{=} \text{let } \langle p_1, p_2 \rangle = \underline{b}^\triangleleft(\text{Faexp}^\triangleright[[A_1]]r, \text{Faexp}^\triangleright[[A_2]]r, p) \text{ in} \\ \text{Baexp}^\triangleleft[[A_1]](r)p_1 \dot{\cap} \text{Baexp}^\triangleleft[[A_2]](r)p_2$$



Parameterized by the following backward abstract operations on L :

$$n^{\triangleleft}(p) \stackrel{\text{def}}{=} (\underline{n} \in \gamma(p) \cap \mathbb{I}) \quad (36)$$

$$?^{\triangleleft}(p) \stackrel{\text{def}}{=} (\gamma(p) \cap \mathbb{I} \neq \emptyset) \quad (37)$$

$$\begin{aligned} u^{\triangleleft}(q, p) &\sqsupseteq \alpha(\{i \in \gamma(q) \mid \underline{i} \in \gamma(p) \cap \mathbb{I}\}) & (38) \\ &= \alpha \circ b^{\triangleleft}(\gamma(q), \gamma(p)) \end{aligned}$$

$$\begin{aligned} b^{\triangleleft}(q_1, q_2, p) &\sqsupseteq^2 \alpha^2(\{i_1, i_2 \in \gamma^2((q_1, q_2)) \mid i_1 \underline{b} i_2 \in \gamma(p) \cap \mathbb{I}\}) & (39) \\ &= \alpha^2(u^{\triangleleft}(\gamma(q_1), \gamma(q_2), \gamma(p))) \end{aligned}$$



$$= \quad \{ \text{def. (6) of } \dot{\gamma} \}$$

$$\dot{\alpha}(\emptyset)$$

$$= \quad \{ \text{def. (5) of } \dot{\alpha} \}$$

$$\lambda Y. \perp.$$

Given any $r \in \mathbb{V} \mapsto L$, $r \neq \lambda Y. \perp$ or $\gamma(\perp) \neq \emptyset$ and $p \in L$, we proceed by structural induction on the arithmetic expression A .

1 — When $A = n \in \text{Nat}$ is a number, we have

$$\alpha^{\triangleleft}(\text{Baexp}[\underline{n}])(r)p$$

$$= \dot{\alpha}(\text{Baexp}[\underline{n}](\dot{\gamma}(r))\gamma(p)) \quad \{ \text{def. (32) of } \alpha^{\triangleleft} \}$$

$$= \dot{\alpha}((\underline{n} \in \gamma(p) \cap \mathbb{I} ? \dot{\gamma}(r) : \emptyset)) \quad \{ \text{def. (25) of Baexp}[\underline{n}] \}$$

$$= \quad \{ \text{def. conditional } (\dots ? \dots : \dots) \}$$

$$(\underline{n} \in \gamma(p) \cap \mathbb{I} ? \dot{\alpha}(\dot{\gamma}(r)) : \dot{\alpha}(\emptyset))$$

$$\stackrel{\dot{\subseteq}}{=} \quad \{ \dot{\alpha} \circ \dot{\gamma} \text{ is reductive and def. (5) of } \dot{\alpha} \}$$



Calculational design of the generic backward/bottom-up non-relational abstract semantics of arithmetic expressions

PROOF. We derive $\text{Baexp}^{\triangleleft}[[A]]$ by calculus, as follows

$$\alpha^{\triangleleft}(\text{Baexp}[[A]])$$

$$= \quad \{ \text{def. (32) of } \alpha^{\triangleleft} \}$$

$$\lambda r \in \mathbb{V} \mapsto L. \lambda p \in L. \dot{\alpha}(\text{Baexp}[[A]](\dot{\gamma}(r))\gamma(p))$$

$$= \quad \{ \text{def. (19) of Baexp}[[A]] \}$$

$$\lambda r \in \mathbb{V} \mapsto L. \lambda p \in L. \dot{\alpha}(\{ \rho \in \dot{\gamma}(r) \mid \exists i \in \gamma(p) \cap \mathbb{I} : \rho \vdash A \Rightarrow i \}).$$

If r is the infimum $\lambda Y. \perp$ where the infimum \perp of L is such that $\gamma(\perp) = \emptyset$, then $\dot{\gamma}(r) = \emptyset$ whence

$$\alpha^{\triangleleft}(\text{Baexp}[[A]])(\lambda Y. \perp)p$$



$$(\underline{n} \in \gamma(p) \cap \mathbb{I} ? r : \lambda Y. \perp)$$

$$= \quad \{ \text{by defining } n^{\triangleleft}(p) \stackrel{\text{def}}{=} (\underline{n} \in \gamma(p) \cap \mathbb{I}) \}$$

$$(\underline{n}^{\triangleleft}(p) ? r : \lambda Y. \perp)$$

$$= \quad \{ \text{by defining } \text{Baexp}^{\triangleleft}[\underline{n}](r)p \stackrel{\text{def}}{=}} (\underline{n}^{\triangleleft}(p) ? r : \lambda Y. \perp) \}$$

$$\text{Baexp}^{\triangleleft}[\underline{n}](r)p.$$

2 — When $A = X \in \mathbb{V}$ is a variable, we have

$$\alpha^{\triangleleft}(\text{Baexp}[[X]])(r)p$$

$$= \dot{\alpha}(\text{Baexp}[[X]](\dot{\gamma}(r))\gamma(p)) \quad \{ \text{def. (32) of } \alpha^{\triangleleft} \}$$

$$= \quad \{ \text{def. (26) of Baexp}[[X]] \}$$

$$\dot{\alpha}(\{ \rho \in \dot{\gamma}(r) \mid \rho(X) \in \gamma(p) \cap \mathbb{I} \})$$

$$\stackrel{\dot{\subseteq}}{=} \quad \{ [\gamma \circ \alpha \text{ is extensive and } \dot{\alpha} \text{ is monotone}] \}$$

$$\dot{\alpha}(\{ \rho \in \dot{\gamma}(r) \mid \rho(X) \in \gamma(p) \cap \gamma \circ \alpha(\mathbb{I}) \})$$



$$\begin{aligned}
&= \quad \{\text{def. (6) of } \dot{\gamma}\} \\
&\quad \dot{\alpha}(\{\rho \mid \forall Y \neq X : \rho(Y) \in \gamma(r(Y)) \wedge \rho(X) \in \gamma(r(X)) \cap \gamma(p) \cap \gamma \circ \alpha(\mathbb{I})\}) \\
&= \quad \{\gamma \text{ is a complete meet morphism}\} \\
&\quad \dot{\alpha}(\{\rho \mid \forall Y \neq X : \rho(Y) \in \gamma(r(Y)) \wedge \rho(X) \in \gamma(r(X)) \sqcap p \sqcap \alpha(\mathbb{I})\}) \\
&= \quad \{\text{def. environment assignment}\} \\
&\quad \dot{\alpha}(\{\rho \mid \forall Y \neq X : \rho(Y) \in \gamma(r[X := r(X)] \sqcap p \sqcap \alpha(\mathbb{I}))(Y) \wedge \rho(X) \in \\
&\quad \gamma(r[X := r(X)] \sqcap p \sqcap \alpha(\mathbb{I}))(X)\}) \\
&= \quad \{\text{def. (6) of } \dot{\gamma}\} \\
&\quad \dot{\alpha}(\{\rho \mid \rho \in \dot{\gamma}(r[X := r(X)] \sqcap p \sqcap \alpha(\mathbb{I}))\}) \\
&= \quad \{\text{set notation}\} \\
&\quad \dot{\alpha}(\dot{\gamma}(r[X := r(X)] \sqcap p \sqcap \alpha(\mathbb{I}))) \\
\dot{\subseteq} \quad &\quad \{\dot{\alpha} \circ \dot{\gamma} \text{ is reductive}\} \\
&\quad r[X := r(X)] \sqcap p \sqcap \alpha(\mathbb{I}) \\
\dot{\subseteq} \quad &\quad \{\text{def. (16) of } ?^{\flat}\}
\end{aligned}$$



$$\begin{aligned}
&= \quad \{\text{negation}\} \\
&\quad (\gamma(p) \cap \mathbb{I} \neq \emptyset \ ? \ r : \lambda Y. \perp) \\
&= \quad \{\text{by defining } ?^{\flat}(p) \stackrel{\text{def}}{=} (\gamma(p) \cap \mathbb{I} \neq \emptyset)\} \\
&\quad (?^{\flat}(p) \ ? \ r : \lambda Y. \perp) \\
&= \quad \{\text{by defining } \text{Baexp}^{\flat}[[?] \stackrel{\text{def}}{=}} (?^{\flat}(p) \ ? \ r : \lambda Y. \perp)\} \\
&\quad \text{Baexp}^{\flat}[[?](r)p .
\end{aligned}$$

4 — When $A = u A'$ is a unary operation, we have

$$\begin{aligned}
&\alpha^{\flat}(\text{Baexp}[[u A']](r)p) \\
&= \dot{\alpha}(\text{Baexp}[[u A']](\dot{\gamma}(r))(\gamma(p))) \quad \{\text{def. (32) of } \alpha^{\flat}\} \\
&= \quad \{\text{def. (28) of } \text{Baexp}[[u A']]\} \\
&\quad \dot{\alpha}(\text{Baexp}[[A']](\dot{\gamma}(r))(\underline{u}^{\flat}(\text{Faexp}[[A']](\dot{\gamma}(r)), \gamma(p)))) \\
\dot{\subseteq} \quad &\quad \{\gamma \circ \alpha \text{ is extensive and monotony}\}
\end{aligned}$$



$$\begin{aligned}
&r[X := r(X)] \sqcap p \sqcap ?^{\flat} \\
&= \quad \{\text{by defining } \text{Baexp}^{\flat}[[X](r)p \stackrel{\text{def}}{=} } r[X := r(X)] \sqcap p \sqcap ?^{\flat}\} \\
&\quad \text{Baexp}^{\flat}[[X](r)p .
\end{aligned}$$

3 — When $A = ?$ is random, we have

$$\begin{aligned}
&\alpha^{\flat}(\text{Baexp}[[?]](r)p) \\
&= \dot{\alpha}(\text{Baexp}[[?](\dot{\gamma}(r))\gamma(p)]) \quad \{\text{def. (32) of } \alpha^{\flat}\} \\
&= \quad \{\text{def. (27) of } \text{Baexp}[[?]]\} \\
&= \dot{\alpha}((\gamma(p) \cap \mathbb{I} = \emptyset \ ? \ \emptyset : \dot{\gamma}(r))) \\
&= \quad \{\text{def. conditional } (\dots \ ? \ \dots : \dots)\} \\
&\quad (\gamma(p) \cap \mathbb{I} = \emptyset \ ? \ \dot{\alpha}(\emptyset) : \dot{\alpha}(\dot{\gamma}(r))) \\
\dot{\subseteq} \quad &\quad \{\text{def. (5) of } \dot{\alpha} \text{ and } \dot{\alpha} \circ \dot{\gamma} \text{ reductive}\} \\
&\quad (\gamma(p) \cap \mathbb{I} = \emptyset \ ? \ \lambda Y. \perp : r)
\end{aligned}$$



$$\begin{aligned}
&\dot{\alpha}(\text{Baexp}[[A']](\dot{\gamma}(r))(\gamma \circ \alpha \circ \underline{u}^{\flat}(\gamma \circ \alpha \circ \text{Faexp}[[A']](\dot{\gamma}(r)), \gamma(p)))) \\
&= \quad \{\text{def. (8) of } \alpha^{\flat}(\Phi) \stackrel{\text{def}}{=} } \alpha \circ \Phi \circ \dot{\gamma}\} \\
&\quad \dot{\alpha}(\text{Baexp}[[A']](\dot{\gamma}(r))(\gamma \circ \alpha \circ \underline{u}^{\flat}(\gamma \circ \alpha^{\flat}(\text{Faexp}[[A']](r), \gamma(p)))) \\
\dot{\subseteq} \quad &\quad \{\text{by (9) so that } \text{Faexp}^{\flat}[[A]] \dot{\subseteq} \alpha^{\flat}(\text{Faexp}[[A]]) \text{ and monotony}\} \\
&\quad \dot{\alpha}(\text{Baexp}[[A']](\dot{\gamma}(r))(\gamma \circ \alpha \circ \underline{u}^{\flat}(\gamma \circ \text{Faexp}^{\flat}[[A']](r), \gamma(p)))) \\
\dot{\subseteq} \quad &\quad \{\text{by def. (28) of } u^{\flat}(Q, P) \stackrel{\text{def}}{=} } \{v \in Q \mid \underline{u} v \in P \cap \mathbb{I}\} \text{ so that } u^{\flat}(Q, P) \dot{\subseteq} \\
&\quad \alpha \circ \underline{u}^{\flat}(\gamma(Q), \gamma(P))\} \\
&\quad \dot{\alpha}(\text{Baexp}[[A']](\dot{\gamma}(r))(\gamma \circ u^{\flat}(\text{Faexp}^{\flat}[[A']](r), p))) \\
&= \text{Baexp}[[A']](\dot{\gamma}(r))(u^{\flat}(\text{Faexp}^{\flat}[[A']](r), p)) \quad \{\text{def. (32) of}\} \\
&\quad \alpha^{\flat}(\Phi)(r)p \stackrel{\text{def}}{=} } \dot{\alpha}(\Phi(\dot{\gamma}(r))\gamma(p))\} \\
&\quad \text{Baexp}^{\flat}[[A']](r)(u^{\flat}(\text{Faexp}^{\flat}[[A']](r), p)) \\
&= \quad \{\text{defining } \text{Baexp}^{\flat}[[u A']](r)p \stackrel{\text{def}}{=} } \text{Baexp}^{\flat}[[A']](r)(u^{\flat}(\text{Faexp}^{\flat}[[A']](r), p))\}
\end{aligned}$$



$\text{Baexp}^{\triangleleft} \llbracket u \ A' \rrbracket (r) p$.

5 — When $A = A_1 \text{ b } A_2$ is a binary operation, we have

$$\begin{aligned}
& \alpha^{\triangleleft}(\text{Baexp} \llbracket A_1 \text{ b } A_2 \rrbracket)(r) p \\
= & \dot{\alpha}(\text{Baexp} \llbracket A_1 \text{ b } A_2 \rrbracket)(\dot{\gamma}(r))(\gamma(p)) \quad \{\text{def. (32) of } \alpha^{\triangleleft} \} \\
= & \quad \{\text{def. (29) of } \text{Baexp} \llbracket A_1 \text{ b } A_2 \rrbracket \} \\
= & \text{let } \langle p_1, p_2 \rangle = \text{b}_{\dot{\gamma}}^{\triangleleft}(\text{Faexp} \llbracket A_1 \rrbracket(\dot{\gamma}(r)), \text{Faexp} \llbracket A_2 \rrbracket(\dot{\gamma}(r)), (\gamma(p))) \text{ in} \\
& \dot{\alpha}(\text{Baexp} \llbracket A_1 \rrbracket((\dot{\gamma}(r))) p_1 \cap \text{Baexp} \llbracket A_2 \rrbracket((\dot{\gamma}(r))) p_2) \\
\dot{\sqsubseteq} & \quad \{\gamma \circ \alpha \text{ is extensive and by monotony}\} \\
& \text{let } \langle p_1, p_2 \rangle = \text{b}_{\dot{\gamma}}^{\triangleleft}(\gamma \circ \alpha^{\triangleright}(\text{Faexp} \llbracket A_1 \rrbracket)(r), \gamma \circ \alpha^{\triangleright}(\text{Faexp} \llbracket A_2 \rrbracket)(r), (\gamma(p))) \text{ in} \\
& \dot{\alpha}(\text{Baexp} \llbracket A_1 \rrbracket((\dot{\gamma}(r))) \gamma \circ \alpha(p_1) \cap \text{Baexp} \llbracket A_2 \rrbracket((\dot{\gamma}(r))) \gamma \circ \alpha(p_2)) \\
= & \quad \{\text{def. (8) of } \alpha^{\triangleright}(\phi) \stackrel{\text{def}}{=} \alpha \circ \phi \circ \dot{\gamma} \} \\
& \text{let } \langle p_1, p_2 \rangle = \text{b}_{\dot{\gamma}}^{\triangleleft}(\gamma \circ \alpha^{\triangleright}(\text{Faexp} \llbracket A_1 \rrbracket)(r), \gamma \circ \alpha^{\triangleright}(\text{Faexp} \llbracket A_2 \rrbracket)(r), (\gamma(p))) \text{ in} \\
& \dot{\alpha}(\text{Baexp} \llbracket A_1 \rrbracket((\dot{\gamma}(r))) \gamma \circ \alpha(p_1) \cap \text{Baexp} \llbracket A_2 \rrbracket((\dot{\gamma}(r))) \gamma \circ \alpha(p_2)) \\
\dot{\sqsubseteq} & \quad \{\text{by (9) so that } \text{Faexp}^{\triangleright} \llbracket A \rrbracket \dot{\sqsupseteq} \alpha^{\triangleright}(\text{Faexp} \llbracket A \rrbracket) \text{ and monotony}\}
\end{aligned}$$



$$\begin{aligned}
& \text{let } \langle p_1, p_2 \rangle = \text{b}^{\triangleleft}(\text{Faexp}^{\triangleright} \llbracket A_1 \rrbracket r, \text{Faexp}^{\triangleright} \llbracket A_2 \rrbracket r, p) \text{ in} \\
& \text{Baexp}^{\triangleleft} \llbracket A_1 \rrbracket (r) p_1 \dot{\cap} \text{Baexp}^{\triangleleft} \llbracket A_2 \rrbracket (r) p_2 \\
= & \quad \{\text{defining } \text{Baexp}^{\triangleleft} \llbracket A_1 \text{ b } A_2 \rrbracket (r) p \stackrel{\text{def}}{=}} \\
& \text{let } \langle p_1, p_2 \rangle = \text{b}^{\triangleleft}(\text{Faexp}^{\triangleright} \llbracket A_1 \rrbracket r, \text{Faexp}^{\triangleright} \llbracket A_2 \rrbracket r, p) \text{ in} \\
& \text{Baexp}^{\triangleleft} \llbracket A_1 \rrbracket (r) p_1 \dot{\cap} \text{Baexp}^{\triangleleft} \llbracket A_2 \rrbracket (r) p_2 \} \\
& \text{Baexp}^{\triangleleft} \llbracket A_1 \text{ b } A_2 \rrbracket (r) p .
\end{aligned}$$

□



$$\begin{aligned}
& \text{let } \langle p_1, p_2 \rangle = \text{b}_{\dot{\gamma}}^{\triangleleft}(\gamma \circ \text{Faexp}^{\triangleright} \llbracket A_1 \rrbracket (r), \gamma \circ \text{Faexp}^{\triangleright} \llbracket A_2 \rrbracket (r), (\gamma(p))) \text{ in} \\
& \dot{\alpha}(\text{Baexp} \llbracket A_1 \rrbracket((\dot{\gamma}(r))) \gamma \circ \alpha(p_1) \cap \text{Baexp} \llbracket A_2 \rrbracket((\dot{\gamma}(r))) \gamma \circ \alpha(p_2)) \\
= & \quad \{\text{def. } \alpha^2(\langle x, y \rangle) \stackrel{\text{def}}{=} \langle \alpha(x), \alpha(y) \rangle \} \\
& \text{let } \langle p_1, p_2 \rangle = \alpha^2 \circ \text{b}_{\dot{\gamma}}^{\triangleleft}(\gamma \circ \text{Faexp}^{\triangleright} \llbracket A_1 \rrbracket r, \gamma \circ \text{Faexp}^{\triangleright} \llbracket A_2 \rrbracket r, (\gamma(p))) \text{ in} \\
& \dot{\alpha}(\text{Baexp} \llbracket A_1 \rrbracket((\dot{\gamma}(r))) \gamma(p_1) \cap \text{Baexp} \llbracket A_2 \rrbracket((\dot{\gamma}(r))) \gamma(p_2)) \\
\dot{\sqsubseteq} & \quad \{\text{by def. (29) of } \text{b}_{\dot{\gamma}}^{\triangleleft}(p_1, p_2, p) \stackrel{\text{def}}{=} \{ \langle v_1, v_2 \rangle \in p_1 \times p_2 \mid v_1 \text{ b } v_2 \in p \cap \mathbb{I} \} \text{ so} \\
& \text{that } \text{b}^{\triangleleft}(p_1, p_2, p) \dot{\sqsupseteq} \alpha^2 \circ \text{b}_{\dot{\gamma}}^{\triangleleft}(\gamma(p_1), \gamma(p_2), \gamma(p)) \text{ and monotony}\} \\
& \text{let } \langle p_1, p_2 \rangle = \text{b}^{\triangleleft}(\text{Faexp}^{\triangleright} \llbracket A_1 \rrbracket r, \text{Faexp}^{\triangleright} \llbracket A_2 \rrbracket r, p) \text{ in} \\
& \dot{\alpha}(\text{Baexp} \llbracket A_1 \rrbracket(\dot{\gamma}(r))(\gamma(p_1)) \cap \text{Baexp} \llbracket A_2 \rrbracket(\dot{\gamma}(r))(\gamma(p_2))) \\
\dot{\sqsubseteq} & \quad \{\alpha^{\triangleleft} \text{ is monotone and so } \alpha^{\triangleleft}(x \cap y) \dot{\sqsubseteq} \alpha^{\triangleleft}(x) \dot{\cap} \alpha^{\triangleleft}(y) \} \\
& \text{let } \langle p_1, p_2 \rangle = \text{b}^{\triangleleft}(\text{Faexp}^{\triangleright} \llbracket A_1 \rrbracket r, \text{Faexp}^{\triangleright} \llbracket A_2 \rrbracket r, p) \text{ in} \\
& \dot{\alpha}(\text{Baexp} \llbracket A_1 \rrbracket(\dot{\gamma}(r))(\gamma(p_1))) \dot{\cap} \dot{\alpha}(\text{Baexp} \llbracket A_2 \rrbracket(\dot{\gamma}(r))(\gamma(p_2))) \\
= & \quad \{\text{def. (32) of } \alpha^{\triangleleft}(\phi)(r) p \stackrel{\text{def}}{=} \dot{\alpha}(\phi(\dot{\gamma}(r)) \gamma(p)) \} \\
& \text{let } \langle p_1, p_2 \rangle = \text{b}^{\triangleleft}(\text{Faexp}^{\triangleright} \llbracket A_1 \rrbracket r, \text{Faexp}^{\triangleright} \llbracket A_2 \rrbracket r, p) \text{ in} \\
& \alpha^{\triangleleft}(\text{Baexp} \llbracket A_1 \rrbracket (r) p_1 \dot{\cap} \alpha^{\triangleleft}(\text{Baexp} \llbracket A_2 \rrbracket (r) p_2) \\
\dot{\sqsubseteq} & \quad \{\text{by (33) so that } \text{Baexp}^{\triangleleft} \llbracket A \rrbracket \dot{\sqsupseteq} \alpha^{\triangleleft}(\text{Baexp} \llbracket A \rrbracket) \text{ and monotony of } \dot{\cap} \}
\end{aligned}$$



Implementation of the structural definition of the generic backward/bottom-up non-relational abstract semantics of arithmetic expressions

```

1 (* baexp.mli *)
2 open Abstract_Syntax
3 open Avalues
4 open Aenv
5 (* backward evaluation of arithmetic operations *)
6 val b_aexp : aexp -> Aenv.t -> Avalues.t -> Aenv.t

```



```

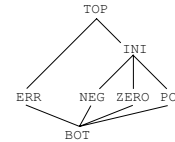
7 (* baexp.ml *)
8 open Abstract_Syntax
9 (* Backward abstract interpretation of arithmetic operations *)
10 let rec b_aexp' a r p =
11   match a with
12   | (NAT i) -> if (Avalues.b_NAT i p) then r else (Aenv.bot ())
13   | (VAR v) ->
14     (Aenv.set r v (Avalues.meet (Avalues.meet (Aenv.get r v) p) (Avalues.f_RANDOM ()
15 | RANDOM -> if (Avalues.b_RANDOM p) then r else (Aenv.bot ())
16 | (UMINUS a1) -> (b_aexp' a1 r (Avalues.b_UMINUS (Aaexp.a_aexp a1 r) p))
17 | (UPLUS a1) -> (b_aexp' a1 r (Avalues.b_UPLUS (Aaexp.a_aexp a1 r) p))
18 | (PLUS (a1, a2)) ->
19   let (p1,p2) = (Avalues.b_PLUS (Aaexp.a_aexp a1 r) (Aaexp.a_aexp a2 r) p)
20   in (Aenv.meet (b_aexp' a1 r p1) (b_aexp' a2 r p2))
21 | (MINUS (a1, a2)) ->
22   let (p1,p2) = (Avalues.b_MINUS (Aaexp.a_aexp a1 r) (Aaexp.a_aexp a2 r) p)
23   in (Aenv.meet (b_aexp' a1 r p1) (b_aexp' a2 r p2))
24 | (TIMES (a1, a2)) ->
25   let (p1,p2) = (Avalues.b_TIMES (Aaexp.a_aexp a1 r) (Aaexp.a_aexp a2 r) p)

```



Primitive backward/bottom-up non-relational abstract operations for initialization and simple sign analysis

We must now define the primitive operations n^\triangleleft , $?^\triangleleft$, u^\triangleleft , b^\triangleleft for the abstract lattice



$$\gamma(\text{BOT}) \stackrel{\text{def}}{=} \{\Omega_a\}$$

$$\gamma(\text{NEG}) \stackrel{\text{def}}{=} [\text{min_int}, -1] \cup \{\Omega_a\}$$

$$\gamma(\text{ZERO}) \stackrel{\text{def}}{=} \{0, \Omega_a\}$$

$$\gamma(\text{POS}) \stackrel{\text{def}}{=} [1, \text{max_int}] \cup \{\Omega_a\}$$

$$\gamma(\text{INI}) \stackrel{\text{def}}{=} \mathbb{I} \cup \{\Omega_a\},$$

$$\gamma(\text{ERR}) \stackrel{\text{def}}{=} \{\Omega_i, \Omega_a\}$$

$$\gamma(\text{TOP}) \stackrel{\text{def}}{=} \mathbb{I}_\Omega$$



```

26   in (Aenv.meet (b_aexp' a1 r p1) (b_aexp' a2 r p2))
27 | (DIV (a1, a2)) ->
28   let (p1,p2) = (Avalues.b_DIV (Aaexp.a_aexp a1 r) (Aaexp.a_aexp a2 r) p)
29   in (Aenv.meet (b_aexp' a1 r p1) (b_aexp' a2 r p2))
30 | (MOD (a1, a2)) ->
31   let (p1,p2) = (Avalues.b_MOD (Aaexp.a_aexp a1 r) (Aaexp.a_aexp a2 r) p)
32   in (Aenv.meet (b_aexp' a1 r p1) (b_aexp' a2 r p2))
33 let b_aexp a r p =
34 if (Aenv.is_bot r) & (Avalues.isbotempty ()) then (Aenv.bot ()) else b_aexp' a r p

```



Implementation of the primitive backward/bottom-up non-relational abstract arithmetic operations for initialization and simple sign analysis

1 — In the abstract interpretation (35) of variables, we have

$$?^\triangleright = \text{INI}$$

by definition (17) of α .



2 — From the definition (36) of n^\triangleleft and (18) of γ , we directly get by case analysis

$n^\triangleleft(p)$	p						
	BOT	NEG	ZERO	POS	INI	ERR	TOP
$\underline{n} \in [\text{min_int}, -1]$	ff	tt	ff	ff	tt	ff	tt
$\underline{n} = 0$	ff	ff	tt	ff	tt	ff	tt
$\underline{n} \in [1, \text{max_int}]$	ff	ff	ff	tt	tt	ff	tt
$\underline{n} < \text{min_int} \vee \underline{n} > \text{max_int}$	ff	ff	ff	ff	ff	ff	ff



PROOF. Let us consider a few typical cases.

5 — If $p = \text{BOT}$ or $p = \text{ERR}$ then by (18),

$$\underline{u} i \in \gamma(p) \cap \mathbb{I} \subseteq \{\Omega_i, \Omega_a\} \cap [\text{min_int}, \text{max_int}] = \emptyset$$

is false so that $u^\triangleleft(q, p) = \alpha(\emptyset) = \text{BOT}$.

6 — If $p = \text{POS}$ then by (18), $\underline{u} i \in \gamma(p) \cap \mathbb{I} = [1, \text{max_int}]$ if and only if (by def. (30) of \underline{u}) $i \in [\text{min_int} + 1, -1]$ so that $u^\triangleleft(q, p) = \alpha(\gamma(q) \cap [\text{min_int} + 1, -1]) \subseteq \alpha(\gamma(q) \cap \gamma(\text{NEG}))$ by (18). But γ preserves meets whence this is equal to $\alpha(\gamma(q \sqcap \text{NEG})) \sqsubseteq q \sqcap \text{NEG}$ since $\alpha \circ \gamma$ is reductive.

7 — If $p = \text{INI}$ or $p = \text{TOP}$ then by (18), $\underline{u} i \in \gamma(p) \cap \mathbb{I} = [\text{min_int}, \text{max_int}]$ if and only if (by def. (30) of \underline{u}) $i \in [\text{min_int} + 1, \text{max_int}]$ so that $u^\triangleleft(q, p) = \alpha(\gamma(q) \cap [\text{min_int} + 1, \text{max_int}]) \subseteq \alpha(\gamma(q) \cap \gamma(\text{INI}))$ by (18). But γ preserves meets whence this is equal to $\alpha(\gamma(q \sqcap \text{INI})) \sqsubseteq q \sqcap \text{INI}$ since $\alpha \circ \gamma$ is reductive. \square



3 — From the definition (37) of $?^\triangleleft$ and (18) of γ , we directly get by case analysis

p	BOT	NEG	ZERO	POS	INI	ERR	TOP
$?^\triangleleft(p)$	ff	tt	tt	tt	tt	ff	tt

4 — For the backward unary arithmetic operations (38), we have

p	BOT	NEG	ZERO	POS	INI	ERR	TOP
$+^\triangleleft(q, p)$	BOT	$q \sqcap \text{NEG}$	$q \sqcap \text{ZERO}$	$q \sqcap \text{POS}$	$q \sqcap \text{INI}$	BOT	$q \sqcap \text{INI}$
$-^\triangleleft(q, p)$	BOT	$q \sqcap \text{POS}$	$q \sqcap \text{ZERO}$	$q \sqcap \text{NEG}$	$q \sqcap \text{INI}$	BOT	$q \sqcap \text{INI}$



8 — For the backward binary arithmetic operations (39), we have

$$\begin{aligned} /^\triangleleft(q_1, q_2, p) &\stackrel{\text{def}}{=} \text{mod}^\triangleleft(q_1, q_2, p) \stackrel{\text{def}}{=} \\ &(\langle q_1 \in \{\text{BOT}, \text{NEG}, \text{ERR}\} \vee q_2 \in \{\text{BOT}, \text{NEG}, \text{ZERO}, \text{ERR}\} \vee p \in \{\text{BOT}, \text{NEG}, \text{ERR}\} ? \\ &\quad \langle \text{BOT}, \text{BOT} \rangle \\ &\quad : (p = \text{POS} ? \text{smash}(\langle q_1 \sqcap \text{POS}, q_2 \sqcap \text{POS} \rangle) : \langle q_1 \sqcap \text{INI}, q_2 \sqcap \text{POS} \rangle)) \\ \text{smash}(\langle x, y \rangle) &\stackrel{\text{def}}{=} (x = \text{BOT} \vee y = \text{BOT} ? \langle \text{BOT}, \text{BOT} \rangle : \langle x, y \rangle) . \end{aligned}$$

PROOF. If $b \in \{/, \text{mod}\}$ and $q_1 \in \{\text{BOT}, \text{NEG}, \text{ERR}\}$ or $q_2 \in \{\text{BOT}, \text{NEG}, \text{ZERO}, \text{ERR}\}$ then $i_1 \in \gamma(q_1) \subseteq [\text{min_int}, -1] \cup \{\Omega_i, \Omega_a\}$ or $i_2 \in \gamma(q_2) \subseteq [\text{min_int}, 0] \cup \{\Omega_i, \Omega_a\}$ in which case $i_1 \sqcup i_2 \notin \mathbb{I}$ by (31). It follows that $b^\triangleleft(q_1, q_2, p) = \alpha^2(\emptyset) = \langle \text{BOT}, \text{BOT} \rangle$ by componentwise definition of α^2 and (17).



If $p \in \{\text{BOT}, \text{NEG}, \text{ERR}\}$ then $i_1 \underline{b} i_2 \notin \gamma(p) \cap \mathbb{I} \subseteq [\text{min_int}, -1]$ in contradiction with (31) showing that $i_1 \underline{b} i_2$ is not negative. Again $b^\triangleleft(q_1, q_2, p) = \alpha^2(\emptyset) = \langle \text{BOT}, \text{BOT} \rangle$ by componentwise definition of α^2 and (17).

Otherwise to have $i_1 \underline{b} i_2 \in \mathbb{I}$, we must have $i_1 \in [0, \text{max_int}]$ and $i_2 \in [1, \text{max_int}]$ whence necessarily $i_1 \in \gamma(\text{INI})$ and $i_2 \in \gamma(\text{POS})$ so that

$\alpha^2(\gamma^2(\langle q_1 \sqcap \text{INI}, q_2 \sqcap \text{POS} \rangle)) \sqsubseteq^2 \langle q_1 \sqcap \text{INI}, q_2 \sqcap \text{POS} \rangle \stackrel{\text{def}}{=} b^\triangleleft(q_1, q_2, p)$. Moreover the quotient is strictly positive only if the dividend is non zero. \square

9 — With the same reasoning, for addition $+^\triangleleft$, we have

$$+^\triangleleft(q_1, q_2, p) = \langle \text{BOT}, \text{BOT} \rangle \quad \text{if } q_1 \in \{\text{BOT}, \text{ERR}\} \vee q_2 \in \{\text{BOT}, \text{ERR}\} \vee p \in \{\text{BOT}, \text{ERR}\}$$

$$+^\triangleleft(q_1, q_2, p) = \langle q_1 \sqcap \text{INI}, q_2 \sqcap \text{INI} \rangle \text{ if } p \in \{\text{INI}, \text{TOP}\}.$$



$+^\triangleleft(q_1, q_2, \text{POS})$		q_2			
		NEG	ZERO	POS	INI, TOP
q_1	NEG	$\langle \text{BOT}, \text{BOT} \rangle$	$\langle \text{BOT}, \text{BOT} \rangle$	$\langle \text{NEG}, \text{POS} \rangle$	$\langle \text{NEG}, \text{POS} \rangle$
	ZERO	$\langle \text{BOT}, \text{BOT} \rangle$	$\langle \text{BOT}, \text{BOT} \rangle$	$\langle \text{ZERO}, \text{POS} \rangle$	$\langle \text{ZERO}, \text{POS} \rangle$
	POS	$\langle \text{POS}, \text{NEG} \rangle$	$\langle \text{POS}, \text{ZERO} \rangle$	$\langle \text{POS}, \text{POS} \rangle$	$\langle \text{POS}, \text{INI} \rangle$
	INI, TOP	$\langle \text{POS}, \text{NEG} \rangle$	$\langle \text{POS}, \text{ZERO} \rangle$	$\langle \text{INI}, \text{POS} \rangle$	$\langle \text{INI}, \text{INI} \rangle$

10 — The backward ternary subtraction operation $-^\triangleleft$ is defined as

$$-^\triangleleft(q_1, q_2, p) \stackrel{\text{def}}{=} \text{let } (r_1, r_2) = -^\triangleleft(q_1, -^\triangleright(q_2), p) \text{ in } (r_1, -^\triangleright(r_2)).$$



Otherwise

$+^\triangleleft(q_1, q_2, \text{NEG})$		q_2			
		NEG	ZERO	POS	INI, TOP
q_1	NEG	$\langle \text{NEG}, \text{NEG} \rangle$	$\langle \text{NEG}, \text{ZERO} \rangle$	$\langle \text{NEG}, \text{POS} \rangle$	$\langle \text{NEG}, \text{INI} \rangle$
	ZERO	$\langle \text{ZERO}, \text{NEG} \rangle$	$\langle \text{BOT}, \text{BOT} \rangle$	$\langle \text{BOT}, \text{BOT} \rangle$	$\langle \text{ZERO}, \text{NEG} \rangle$
	POS	$\langle \text{POS}, \text{NEG} \rangle$	$\langle \text{BOT}, \text{BOT} \rangle$	$\langle \text{BOT}, \text{BOT} \rangle$	$\langle \text{POS}, \text{NEG} \rangle$
	INI, TOP	$\langle \text{INI}, \text{NEG} \rangle$	$\langle \text{NEG}, \text{ZERO} \rangle$	$\langle \text{NEG}, \text{POS} \rangle$	$\langle \text{INI}, \text{INI} \rangle$

$+^\triangleleft(q_1, q_2, \text{ZERO})$		q_2			
		NEG	ZERO	POS	INI, TOP
q_1	NEG	$\langle \text{BOT}, \text{BOT} \rangle$	$\langle \text{BOT}, \text{BOT} \rangle$	$\langle \text{NEG}, \text{POS} \rangle$	$\langle \text{NEG}, \text{POS} \rangle$
	ZERO	$\langle \text{BOT}, \text{BOT} \rangle$	$\langle \text{ZERO}, \text{ZERO} \rangle$	$\langle \text{BOT}, \text{BOT} \rangle$	$\langle \text{ZERO}, \text{ZERO} \rangle$
	POS	$\langle \text{POS}, \text{NEG} \rangle$	$\langle \text{BOT}, \text{BOT} \rangle$	$\langle \text{BOT}, \text{BOT} \rangle$	$\langle \text{POS}, \text{NEG} \rangle$
	INI, TOP	$\langle \text{POS}, \text{NEG} \rangle$	$\langle \text{ZERO}, \text{ZERO} \rangle$	$\langle \text{NEG}, \text{POS} \rangle$	$\langle \text{INI}, \text{INI} \rangle$



11 — The handling of the backward ternary multiplication operation $*^\triangleleft$ is similar

$*^\triangleleft(q_1, q_2, \text{NEG})$		q_2			
		NEG	ZERO	POS	INI, TOP
q_1	NEG	$\langle \text{BOT}, \text{BOT} \rangle$	$\langle \text{BOT}, \text{BOT} \rangle$	$\langle \text{NEG}, \text{POS} \rangle$	$\langle \text{NEG}, \text{POS} \rangle$
	ZERO	$\langle \text{BOT}, \text{BOT} \rangle$	$\langle \text{BOT}, \text{BOT} \rangle$	$\langle \text{BOT}, \text{BOT} \rangle$	$\langle \text{BOT}, \text{BOT} \rangle$
	POS	$\langle \text{POS}, \text{NEG} \rangle$	$\langle \text{BOT}, \text{BOT} \rangle$	$\langle \text{BOT}, \text{BOT} \rangle$	$\langle \text{POS}, \text{NEG} \rangle$
	INI, TOP	$\langle \text{POS}, \text{NEG} \rangle$	$\langle \text{BOT}, \text{BOT} \rangle$	$\langle \text{NEG}, \text{POS} \rangle$	$\langle \text{INI}, \text{INI} \rangle$



* [⊑] (q ₁ , q ₂ , ZERO)		q ₂			
		NEG	ZERO	POS	INI, TOP
q ₁	NEG	⟨BOT, BOT⟩	⟨NEG, ZERO⟩	⟨BOT, BOT⟩	⟨NEG, ZERO⟩
	ZERO	⟨ZERO, NEG⟩	⟨ZERO, ZERO⟩	⟨ZERO, POS⟩	⟨ZERO, INI⟩
	POS	⟨BOT, BOT⟩	⟨POS, ZERO⟩	⟨BOT, BOT⟩	⟨POS, ZERO⟩
	INI, TOP	⟨ZERO, NEG⟩	⟨INI, ZERO⟩	⟨ZERO, POS⟩	⟨INI, INI⟩

* [⊑] (q ₁ , q ₂ , POS)		q ₂			
		NEG	ZERO	POS	INI, TOP
q ₁	NEG	⟨NEG, NEG⟩	⟨BOT, BOT⟩	⟨BOT, BOT⟩	⟨NEG, NEG⟩
	ZERO	⟨BOT, BOT⟩	⟨BOT, BOT⟩	⟨BOT, BOT⟩	⟨BOT, BOT⟩
	POS	⟨BOT, BOT⟩	⟨BOT, BOT⟩	⟨POS, POS⟩	⟨POS, POS⟩
	INI, TOP	⟨NEG, NEG⟩	⟨BOT, BOT⟩	⟨POS, POS⟩	⟨INI, INI⟩



```

45 val b_PLUS   : t -> t -> t -> t * t
46 val b_MINUS  : t -> t -> t -> t * t
47 val b_TIMES  : t -> t -> t -> t * t
48 val b_DIV    : t -> t -> t -> t * t
49 val b_MOD    : t -> t -> t -> t * t
50 ...

```



Implementation of the primitive backward/bottom-up non-relational abstract arithmetic operations for initialization and simple sign analysis

```

35 (* avalues.mli *)
36 (* abstraction of sets of machine integers by initialization *)
37 (* and simple sign *)
38 type t
39 ...
40 (* backward abstract interpretation of arithmetic expressions *)
41 val b_NAT : string -> t -> bool
42 val b_RANDOM : t -> bool
43 val b_UMINUS : t -> t -> t
44 val b_UPLUS : t -> t -> t

```



```

51 (* avalues.ml *)
52 open Values
53 (* abstraction of sets of machine integers by initialization *)
54 (* and simple sign *)
55 (* complete lattice *)
56 type t = BOT | NEG | ZERO | POS | INI | ERR | TOP
57 (* \gamma(BOT) = {0_(a)} *)
58 (* \gamma(NEG) = [min_int,-1] U {0_(a)} *)
59 (* \gamma(POS) = [1,max_int] U {0_(a)} *)
60 (* \gamma(ZERO) = {0, 0_(a)} *)
61 (* \gamma(INI) = [min_int,max_int] U {0_(a)} *)
62 (* \gamma(ERR) = {0_(i)} *)
63 (* \gamma(TOP) = [min_int,max_int] U {0_(a),0_(i)} *)
64 ...
65 (* backward abstract interpretation of arithmetic expressions *)
66 exception Error_f_NAT of string
67 let remove_zeros i =
68   let l = (String.length i) in
69   if l = 0 then raise (Error_f_NAT "empty integer")

```



```

70   else if l = 1 then i
71   else if (String.get i 0) = '0' then String.sub i 1 (l - 1)
72   else i
73   let b_NAT i p =
74     let i' = (remove_zeros i) in
75     if i' = "0" then
76       match p with
77       | BOT -> false
78       | NEG -> false
79       | ZERO -> true
80       | POS -> false
81       | INI -> true
82       | ERR -> false
83       | TOP -> true
84     else
85       match p with
86       | BOT -> false
87       | NEG -> false
88       | ZERO -> false
89       | POS -> true

```



```

110  | ERR -> BOT
111  | TOP -> meet q INI
112  | _ -> meet q p
113  exception Error_b_PLUS of string
114  let nat_of_lat' u =
115    match u with
116    | NEG -> 0
117    | ZERO -> 1
118    | POS -> 2
119    | INI -> 3
120    | TOP -> 4
121    | _ -> raise (Error_b_PLUS "impossible selection")
122  let select' t u v = t.(nat_of_lat' u).(nat_of_lat' v)
123  let b_PLUS_NEG_table =
124    (*
125     *NEG*) [| | (NEG,NEG) ; (NEG,ZERO) ; (NEG,POS) ; (NEG,INI) ; (NEG,INI) |];
126  (*ZERO*) [| (ZERO,NEG) ; (BOT,BOT) ; (BOT,BOT) ; (ZERO,NEG) ; (ZERO,NEG) |];
127  (*POS*) [| (POS,NEG) ; (BOT,BOT) ; (BOT,BOT) ; (POS,NEG) ; (POS,NEG) |];
128  (*INI*) [| (INI,NEG) ; (NEG,ZERO) ; (NEG,POS) ; (INI,INI) ; (INI,INI) |];
129  (*TOP*) [| (INI,NEG) ; (NEG,ZERO) ; (NEG,POS) ; (INI,INI) ; (INI,INI) |];

```



```

90   | INI -> true
91   | ERR -> false
92   | TOP -> true
93  let b_RANDOM p =
94    match p with
95    | BOT -> false
96    | ERR -> false
97    | _ -> true
98  let b_UMINUS q p =
99    match p with
100   | BOT -> BOT
101   | NEG -> meet q POS
102   | ZERO -> meet q ZERO
103   | POS -> meet q NEG
104   | INI -> meet q INI
105   | ERR -> BOT
106   | TOP -> meet q INI
107  let b_UPLUS q p =
108    match p with
109    | BOT -> BOT

```



```

130  let b_PLUS_ZERO_table =
131  (*NEG*) [| | (BOT,BOT) ; (BOT,BOT) ; (NEG,POS) ; (NEG,POS) ; (NEG,POS) |];
132  (*ZERO*) [| (BOT,BOT) ; (ZERO,ZERO) ; (BOT,BOT) ; (ZERO,ZERO) ; (ZERO,ZERO) |];
133  (*POS*) [| (POS,NEG) ; (BOT,BOT) ; (BOT,BOT) ; (POS,NEG) ; (POS,NEG) |];
134  (*INI*) [| (POS,NEG) ; (ZERO,ZERO) ; (NEG,POS) ; (INI,INI) ; (INI,INI) |];
135  (*TOP*) [| (POS,NEG) ; (ZERO,ZERO) ; (NEG,POS) ; (INI,INI) ; (INI,INI) |];
136  let b_PLUS_POS_table =
137  (*NEG*) [| | (BOT,BOT) ; (BOT,BOT) ; (NEG,POS) ; (NEG,POS) ; (NEG,POS) |];
138  (*ZERO*) [| (BOT,BOT) ; (BOT,BOT) ; (ZERO,POS) ; (ZERO,POS) ; (ZERO,POS) |];
139  (*POS*) [| (POS,NEG) ; (POS,ZERO) ; (POS,INI) ; (POS,INI) ; (POS,INI) |];
140  (*INI*) [| (POS,NEG) ; (POS,ZERO) ; (INI,POS) ; (INI,INI) ; (INI,INI) |];
141  (*TOP*) [| (POS,NEG) ; (POS,ZERO) ; (INI,POS) ; (INI,INI) ; (INI,INI) |];
142  let b_PLUS q1 q2 p =
143    if (q1=BOT) || (q1=ERR) || (q2=BOT) || (q2=ERR) || (p=BOT) || (p=ERR) then
144      (BOT,BOT)
145    else if (p=INI) || (p=TOP) then
146      ((meet q1 INI), (meet q2 INI))
147    else if p = NEG then select' b_PLUS_NEG_table q1 q2
148    else if p = ZERO then select' b_PLUS_ZERO_table q1 q2
149    else if p = POS then select' b_PLUS_POS_table q1 q2

```



```

150   else raise (Error_b_PLUS "impossible case")
151   let b_MINUS q1 q2 p =
152     let r1,r2 = b_PLUS q1 (f_UMINUS q2) p in
153       r1,(f_UMINUS r2)
154   let b_TIMES u v r = print_string "b_TIMES not yet implemented\n";
155                       u,v (* b_TIMES not yet implemented *)
156   let smash x y = if (x=BOT)||(y=BOT) then (BOT,BOT) else (x,y)
157   let b_DIV q1 q2 p =
158     if (q1=BOT)||(q1=NEG)||(q1=ERR)||
159        (q2=BOT)||(q2=NEG)||(q2=ZERO)||(q2=ERR)||
160        (p=BOT)||(p=NEG)||(p=ERR) then
161       (BOT,BOT)
162     else if p = POS then
163       (smash (meet q1 POS) (meet q2 POS))
164     else
165       (smash (meet q1 INI) (meet q2 POS))
166   let b_MOD = b_DIV
167   ...

```



Revisiting the non-relational abstract interpretation of boolean expressions

The abstract interpretation of boolean expressions can be revised as follows, using the backward abstract interpretation of arithmetic expressions:

$$\begin{aligned}
 \text{Abexp}[[B]]\lambda Y.\perp &\stackrel{\text{def}}{=} \lambda Y.\perp && \text{if } \gamma(\perp) = \emptyset && (40) \\
 \text{Abexp}[[\text{true}]]r &\stackrel{\text{def}}{=} r \\
 \text{Abexp}[[\text{false}]]r &\stackrel{\text{def}}{=} \lambda Y.\perp \\
 \text{Abexp}[[A_1 \text{ c } A_2]]r &\stackrel{\text{def}}{=} \\
 &\text{let } \langle p_1, p_2 \rangle = \check{c}(\text{Faexp}^\flat[[A_1]]r, \text{Faexp}^\flat[[A_2]]r) \text{ in} \\
 &\text{Baexp}^\flat[[A_1]](r)p_1 \dot{\cap} \text{Baexp}^\flat[[A_2]](r)p_2
 \end{aligned}$$



Improving the non-relational analysis of boolean expressions using the backward analysis of its arithmetic subexpressions



$$\begin{aligned}
 \text{Abexp}[[B_1 \& B_2]]r &\stackrel{\text{def}}{=} \text{Abexp}[[B_1]]r \dot{\cap} \text{Abexp}[[B_2]]r \\
 \text{Abexp}[[B_1 | B_2]]r &\stackrel{\text{def}}{=} \text{Abexp}[[B_1]]r \dot{\cup} \text{Abexp}[[B_2]]r
 \end{aligned}$$

parameterized by the following abstract comparison operations \check{c} , $c \in \{<, =\}$ on L

$$\check{c}(p_1, p_2) \supseteq^2 \alpha^2(\{ \langle i_1, i_2 \rangle \mid i_1 \in \gamma(p_1) \cap \mathbb{I} \wedge i_2 \in \gamma(p_2) \cap \mathbb{I} \wedge i_1 \subseteq i_2 = \text{tt} \})$$



Calculational design of the revisited non-relational abstract interpretation of boolean expressions

PROOF. All cases have already be handled, except when $B = A_1 \text{ c } A_2$ is an arithmetic comparison. Let us recall that

$$\frac{\rho \vdash A_1 \Rightarrow v_1, \rho \vdash A_2 \Rightarrow v_2}{\rho \vdash A_1 \text{ c } A_2 \Rightarrow v_1 \subseteq v_2}, \quad (41)$$

and

$$\begin{aligned} \Omega_e \subseteq v &\stackrel{\text{def}}{=} \Omega_e, \\ i \subseteq \Omega_e &\stackrel{\text{def}}{=} \Omega_e, \\ i_1 \subseteq i_2 &\stackrel{\text{def}}{=} i_1 \text{ c } i_2. \end{aligned} \quad (42)$$

We have



$$\begin{aligned} &= \text{\{def. (42) of } \subseteq \text{ implying } v_1, v_2 \notin \mathbb{E} = \{\Omega_1, \Omega_a\}\}} \\ \text{let } \langle p_1, p_2 \rangle &= \langle \text{Faexp}^\flat[[A_1]]r, \text{Faexp}^\flat[[A_2]]r \rangle \text{ in} \\ &\dot{\alpha}(\{\rho \in \dot{\gamma}(r) \mid \exists i_1 \in \gamma(p_1) \cap \mathbb{I} : \exists i_2 \in \gamma(p_2) \cap \mathbb{I} : \\ &\quad \rho \vdash A_1 \Rightarrow i_1 \wedge \rho \vdash A_2 \Rightarrow i_2 \wedge i_1 \subseteq i_2 = \mathbf{tt}\}) \\ &= \text{\{set theory\}} \end{aligned}$$

$$\begin{aligned} \text{let } \langle p_1, p_2 \rangle &= \langle \text{Faexp}^\flat[[A_1]]r, \text{Faexp}^\flat[[A_2]]r \rangle \text{ in} \\ &\dot{\alpha}(\{\rho \in \dot{\gamma}(r) \mid \exists \langle i_1, i_2 \rangle \in \{\langle i'_1, i'_2 \rangle \mid i'_1 \in \gamma(p_1) \cap \mathbb{I} \wedge i'_2 \in \gamma(p_2) \cap \mathbb{I} \wedge i'_1 \subseteq i'_2 = \mathbf{tt}\} : \\ &\quad \rho \vdash A_1 \Rightarrow i_1 \wedge \rho \vdash A_2 \Rightarrow i_2 \wedge \wedge\}) \\ \subseteq &\text{\{\gamma^2 \circ \alpha^2 \text{ extensive and } \dot{\alpha} \text{ monotone (4)\}} \}} \end{aligned}$$

$$\begin{aligned} \text{let } \langle p_1, p_2 \rangle &= \langle \text{Faexp}^\flat[[A_1]]r, \text{Faexp}^\flat[[A_2]]r \rangle \text{ in} \\ &\dot{\alpha}(\{\rho \in \dot{\gamma}(r) \mid \exists \langle i_1, i_2 \rangle \in \gamma^2(\alpha^2(\{\langle i'_1, i'_2 \rangle \mid i'_1 \in \gamma(p_1) \cap \mathbb{I} \wedge i'_2 \in \gamma(p_2) \cap \mathbb{I} \wedge \\ &\quad i'_1 \subseteq i'_2 = \mathbf{tt}\})) : \\ &\quad \rho \vdash A_1 \Rightarrow i_1 \wedge \rho \vdash A_2 \Rightarrow i_2 \wedge \wedge\}) \\ \subseteq &\text{\{defining } \check{c} \text{ such that:} \end{aligned}$$

$$\begin{aligned} &\check{c}(p_1, p_2) \supseteq^2 \alpha^2(\{\langle i'_1, i'_2 \rangle \mid i'_1 \in \gamma(p_1) \cap \mathbb{I} \wedge i'_2 \in \gamma(p_2) \cap \mathbb{I} \wedge i'_1 \subseteq i'_2 = \mathbf{tt}\}), \\ &\gamma^2 \text{ and } \dot{\alpha} \text{ monotone (4)\}} \end{aligned}$$



$$\begin{aligned} &\ddot{\alpha}(\text{Cbexp}[[A_1 \text{ c } A_2]]r) \\ &= \dot{\alpha}(\{\rho \in \dot{\gamma}(r) \mid \rho \vdash A_1 \text{ c } A_2 \Rightarrow \mathbf{tt}\}) \\ &= \text{\{def. (41) of } \rho \vdash A_1 \text{ c } A_2 \Rightarrow b\}} \\ &= \dot{\alpha}(\{\rho \in \dot{\gamma}(r) \mid \exists v_1, v_2 \in \mathbb{I}_\Omega : \rho \vdash A_1 \Rightarrow v_1 \wedge \rho \vdash A_2 \Rightarrow v_2 \wedge v_1 \subseteq v_2 = \mathbf{tt}\}) \\ &= \text{\{set theory and } \gamma \circ \alpha \text{ is extensive \}} \\ &= \dot{\alpha}(\{\rho \in \dot{\gamma}(r) \mid \exists v_1 \in \gamma(\alpha(\{v \mid \exists \rho \in \dot{\gamma}(r) : \rho \vdash A_1 \Rightarrow v\})) : \\ &\quad \exists v_2 \in \gamma(\alpha(\{v \mid \exists \rho \in \dot{\gamma}(r) : \rho \vdash A_2 \Rightarrow v\})) : \\ &\quad \rho \vdash A_1 \Rightarrow v_1 \wedge \rho \vdash A_2 \Rightarrow v_2 \wedge v_1 \subseteq v_2 = \mathbf{tt}\}) \\ &= \text{\{set theory and (9)\}} \\ &= \dot{\alpha}(\{\rho \in \dot{\gamma}(r) \mid \exists v_1 \in \gamma(\text{Faexp}^\flat[[A_1]]r) : \exists v_2 \in \gamma(\text{Faexp}^\flat[[A_2]]r) : \\ &\quad \rho \vdash A_1 \Rightarrow v_1 \wedge \rho \vdash A_2 \Rightarrow v_2 \wedge v_1 \subseteq v_2 = \mathbf{tt}\}) \\ &= \text{\{let notation\}} \\ \text{let } \langle p_1, p_2 \rangle &= \langle \text{Faexp}^\flat[[A_1]]r, \text{Faexp}^\flat[[A_2]]r \rangle \text{ in} \\ &\dot{\alpha}(\{\rho \in \dot{\gamma}(r) \mid \exists v_1 \in \gamma(p_1) : \exists v_2 \in \gamma(p_2) : \\ &\quad \rho \vdash A_1 \Rightarrow v_1 \wedge \rho \vdash A_2 \Rightarrow v_2 \wedge v_1 \subseteq v_2 = \mathbf{tt}\}) \end{aligned}$$



$$\begin{aligned} \text{let } \langle p_1, p_2 \rangle &= \langle \text{Faexp}^\flat[[A_1]]r, \text{Faexp}^\flat[[A_2]]r \rangle \text{ in} \\ &\dot{\alpha}(\{\rho \in \dot{\gamma}(r) \mid \exists \langle i_1, i_2 \rangle \in \gamma^2(\check{c}(p_1, p_2)) : \rho \vdash A_1 \Rightarrow i_1 \wedge \rho \vdash A_2 \Rightarrow i_2\}) \\ &= \text{\{let notation\}} \\ \text{let } \langle p_1, p_2 \rangle &= \check{c}(\text{Faexp}^\flat[[A_1]]r, \text{Faexp}^\flat[[A_2]]r) \text{ in} \\ &\dot{\alpha}(\{\rho \in \dot{\gamma}(r) \mid \exists \langle i_1, i_2 \rangle \in \gamma^2(\langle p_1, p_2 \rangle) : \rho \vdash A_1 \Rightarrow i_1 \wedge \rho \vdash A_2 \Rightarrow i_2\}) \\ &= \text{\{set theory\}} \\ \text{let } \langle p_1, p_2 \rangle &= \check{c}(\text{Faexp}^\flat[[A_1]]r, \text{Faexp}^\flat[[A_2]]r) \text{ in} \\ &\dot{\alpha}(\{\rho \in \dot{\gamma}(r) \mid \exists i_1 \in \gamma(p_1) : \rho \vdash A_1 \Rightarrow i_1 \} \cap \{\rho \in \dot{\gamma}(r) \mid \exists i_2 \in \gamma(p_2) : \rho \vdash A_2 \Rightarrow i_2\}) \\ \subseteq &\text{\{\dot{\alpha} monotone (4)\}} \\ \text{let } \langle p_1, p_2 \rangle &= \check{c}(\text{Faexp}^\flat[[A_1]]r, \text{Faexp}^\flat[[A_2]]r) \text{ in} \\ &\dot{\alpha}(\{\rho \in \dot{\gamma}(r) \mid \exists i_1 \in \gamma(p_1) : \rho \vdash A_1 \Rightarrow i_1 \} \cap \\ &\quad \dot{\alpha}(\{\rho \in \dot{\gamma}(r) \mid \exists i_2 \in \gamma(p_2) : \rho \vdash A_2 \Rightarrow i_2\})) \\ &= \text{\{def. (19) of Baexp\}} \\ \text{let } \langle p_1, p_2 \rangle &= \check{c}(\text{Faexp}^\flat[[A_1]]r, \text{Faexp}^\flat[[A_2]]r) \text{ in} \\ &\dot{\alpha}(\text{Baexp}[[A_1]](\dot{\gamma}(r))\gamma(p_1)) \cap \dot{\alpha}(\text{Baexp}[[A_2]](\dot{\gamma}(r))\gamma(p_2)) \\ &= \text{\{def. (32) of } \alpha^2\}} \end{aligned}$$



$$\begin{aligned} & \text{let } \langle p_1, p_2 \rangle = \check{c}(\text{Faexp}^\triangleright[[A_1]]r, \text{Faexp}^\triangleright[[A_2]]r) \text{ in} \\ & \quad \alpha^{\triangleleft}(\text{Baexp}^{\triangleleft}[[A_1]](r)p_1) \sqcap \alpha^{\triangleleft}(\text{Baexp}^{\triangleleft}[[A_2]](r)p_2) \\ \sqsubseteq & \quad \{ \text{def. (33) of Baexp}^{\triangleleft} \text{ and } \sqcap \text{ monotone} \} \\ & \text{let } \langle p_1, p_2 \rangle = \check{c}(\text{Faexp}^\triangleright[[A_1]]r, \text{Faexp}^\triangleright[[A_2]]r) \text{ in} \\ & \quad \text{Baexp}^{\triangleleft}[[A_1]](r)p_1 \sqcap \text{Baexp}^{\triangleleft}[[A_2]](r)p_2 \\ = & \quad \{ \text{by defining Abexp}[[A_1 \text{ c } A_2]]r \stackrel{\text{def}}{=} \\ & \quad \text{let } \langle p_1, p_2 \rangle = \check{c}(\text{Faexp}^\triangleright[[A_1]]r, \text{Faexp}^\triangleright[[A_2]]r) \text{ in} \\ & \quad \text{Baexp}^{\triangleleft}[[A_1]](r)p_1 \sqcap \text{Baexp}^{\triangleleft}[[A_2]](r)p_2 \\ & \quad \text{Abexp}[[A_1 \text{ c } A_2]]r . \end{aligned}$$

□



```

172 (* abexp.ml *)
173 open Abstract_Syntax
174 (* abstract interpretation of boolean operations *)
175 let rec a_bexp' b r =
176   match b with
177   | TRUE       -> r
178   | FALSE      -> (Aenv.bot ())
179   | EQ (a1, a2) ->
180     let (p1,p2) = (Avalues.a_EQ (Aaexp.a_aexp a1 r) (Aaexp.a_aexp a2 r))
181       in (Aenv.meet (Baexp.b_aexp a1 r p1) (Baexp.b_aexp a2 r p2))
182   | LT (a1, a2) ->
183     let (p1,p2) = (Avalues.a_LT (Aaexp.a_aexp a1 r) (Aaexp.a_aexp a2 r))
184       in (Aenv.meet (Baexp.b_aexp a1 r p1) (Baexp.b_aexp a2 r p2))
185   | AND (b1, b2) -> (Aenv.meet (a_bexp' b1 r) (a_bexp' b2 r))
186   | OR (b1, b2)  -> (Aenv.join (a_bexp' b1 r) (a_bexp' b2 r))
187 let a_bexp b r =
188   if (Aenv.is_bot r) & (Avalues.isbotempty ()) then (Aenv.bot ())
189   else a_bexp' b r
190
```



Implementation of the revisited non-relational abstract interpretation of boolean expressions

```

168 (* abexp.mli *)
169 open Abstract_Syntax
170 (* abstract interpretation of boolean operations *)
171 val a_bexp : bexp -> Aenv.t -> Aenv.t

```



Abstract arithmetic comparison operations for the initialization and simple sign analysis

– Generic abstract boolean equality.

The calculational design of the abstract equality operation \cong does not depend upon the specific choice of L .

$$p_1 \cong p_2 \stackrel{\text{def}}{=} \text{let } p = p_1 \sqcap p_2 \sqcap ?^\triangleright \text{ in } \langle p, p \rangle .$$

PROOF.

$$\begin{aligned} & \alpha^2(\{ \langle i_1, i_2 \rangle \mid i_1 \in \gamma(p_1) \cap \mathbb{I} \wedge i_2 \in \gamma(p_2) \cap \mathbb{I} \wedge i_1 \equiv i_2 = \mathbf{tt} \}) \\ & \quad \{ \text{def. (42) of } \equiv \} \\ & \alpha^2(\{ \langle i, i \rangle \mid i \in \gamma(p_1) \cap \gamma(p_2) \cap \mathbb{I} \}) \end{aligned}$$



$$\begin{aligned}
& \sqsubseteq^2 \quad \{\gamma \circ \alpha \text{ is extensive and } \alpha^2 \text{ is monotone}\} \\
& \alpha^2(\{\langle i, i \rangle \mid i \in \gamma(p_1) \cap \gamma(p_2) \cap \gamma(\alpha(\mathbb{I}))\}) \\
& \quad \{\gamma \text{ preserves meets}\} \\
& \alpha^2(\{\langle i, i \rangle \mid i \in \gamma(p_1 \sqcap p_2 \sqcap \alpha(\mathbb{I}))\}) \\
& \quad \{\text{componentwise def. of } \gamma^2\} \\
& \alpha^2(\gamma^2(\langle p_1 \sqcap p_2 \sqcap \alpha(\mathbb{I}), p_1 \sqcap p_2 \sqcap \alpha(\mathbb{I}) \rangle)) \\
& \sqsubseteq^2 \\
& \quad \{\alpha^2 \circ \gamma^2 \text{ is reductive and let notation}\} \\
& \text{let } p = p_1 \sqcap p_2 \sqcap \alpha(\mathbb{I}) \text{ in } \langle p, p \rangle \\
& \sqsubseteq^2 \quad \{\text{def. (16) of } ?^{\flat}\} \\
& \text{let } p = p_1 \sqcap p_2 \sqcap ?^{\flat} \text{ in } \langle p, p \rangle \\
& = \quad \{\text{by defining } \doteq \stackrel{\text{def}}{=} \text{let } p = p_1 \sqcap p_2 \sqcap ?^{\flat} \text{ in } \langle p, p \rangle\}
\end{aligned}$$



— If $p_i \in \{\text{BOT}, \text{ERR}\}$ where $i = 1$ or $i = 2$ then $\gamma(p_i) \subseteq \mathbb{E} = \{\Omega_1, \Omega_2\}$ so that $\gamma(p_i) \cap \mathbb{I} = \emptyset$ and we get:

$$\begin{aligned}
& \alpha^2(\{\langle i_1, i_2 \rangle \mid i_1 \in \gamma(p_1) \cap \mathbb{I} \wedge i_2 \in \gamma(p_2) \cap \mathbb{I} \wedge i_1 \leq i_2 = \text{tt}\}) \\
& = \alpha^2(\emptyset) \\
& = \quad \{\text{componentwise definition of } \alpha^2 \text{ and (17) of } \alpha\} \\
& \langle \text{BOT}, \text{BOT} \rangle \\
& \stackrel{\text{def}}{=} \quad \{\text{def. (43) of } \prec\} \\
& \prec(\text{BOT}, \text{BOT}) ;
\end{aligned}$$

— For $\langle \text{POS}, \text{ZERO} \rangle$, we have

$$\begin{aligned}
& \alpha^2(\{\langle i_1, i_2 \rangle \mid i_1 \in \gamma(\text{POS}) \cap \mathbb{I} \wedge i_2 \in \gamma(\text{ZERO}) \cap \mathbb{I} \wedge i_1 \leq i_2 = \text{tt}\}) \\
& = \quad \{\text{def. (18) of } \gamma \text{ and (42) of } \leq\} \\
& = \alpha^2(\{\langle i_1, 0 \rangle \mid i_1 \in [1, \text{max_int}] \wedge i_1 \leq 0\})
\end{aligned}$$



$\doteq .$

□

— Initialization and simple sign abstract arithmetic comparison operations.

The abstract strict comparison

$$\prec(p_1, p_2) \sqsupseteq^2 \alpha^2(\{\langle i_1, i_2 \rangle \mid i_1 \in \gamma(p_1) \cap \mathbb{I} \wedge i_2 \in \gamma(p_2) \cap \mathbb{I} \wedge i_1 \leq i_2 = \text{tt}\}) \quad (43)$$

for initialization and simple sign analysis is as follows

$\prec(p_1, p_2)$		p_2				
		BOT, ERR	NEG	ZERO	POS	INI, TOP
p_1	BOT, ERR	$\langle \text{BOT}, \text{BOT} \rangle$	$\langle \text{BOT}, \text{BOT} \rangle$	$\langle \text{BOT}, \text{BOT} \rangle$	$\langle \text{BOT}, \text{BOT} \rangle$	$\langle \text{BOT}, \text{BOT} \rangle$
	NEG	$\langle \text{BOT}, \text{BOT} \rangle$	$\langle \text{NEG}, \text{NEG} \rangle$	$\langle \text{NEG}, \text{ZERO} \rangle$	$\langle \text{NEG}, \text{POS} \rangle$	$\langle \text{NEG}, \text{INI} \rangle$
	ZERO	$\langle \text{BOT}, \text{BOT} \rangle$	$\langle \text{BOT}, \text{BOT} \rangle$	$\langle \text{BOT}, \text{BOT} \rangle$	$\langle \text{ZERO}, \text{POS} \rangle$	$\langle \text{ZERO}, \text{POS} \rangle$
	POS	$\langle \text{BOT}, \text{BOT} \rangle$	$\langle \text{BOT}, \text{BOT} \rangle$	$\langle \text{BOT}, \text{BOT} \rangle$	$\langle \text{POS}, \text{POS} \rangle$	$\langle \text{POS}, \text{POS} \rangle$
	INI, TOP	$\langle \text{BOT}, \text{BOT} \rangle$	$\langle \text{NEG}, \text{NEG} \rangle$	$\langle \text{NEG}, \text{ZERO} \rangle$	$\langle \text{INI}, \text{POS} \rangle$	$\langle \text{INI}, \text{INI} \rangle$

PROOF. Let us consider a few typical cases.



$$\begin{aligned}
& = \quad \{\text{set theory}\} \\
& \alpha^2(\emptyset) \\
& = \quad \{\text{componentwise definition of } \alpha^2 \text{ and (17) of } \alpha\} \\
& \langle \text{BOT}, \text{BOT} \rangle \\
& \stackrel{\text{def}}{=} \quad \{\text{def. (43) of } \prec\} \\
& \prec(\text{POS}, \text{ZERO}) .
\end{aligned}$$

— For $\langle \text{TOP}, \text{TOP} \rangle$, we have

$$\begin{aligned}
& \alpha^2(\{\langle i_1, i_2 \rangle \mid i_1 \in \gamma(\text{TOP}) \cap \mathbb{I} \wedge i_2 \in \gamma(\text{TOP}) \cap \mathbb{I} \wedge i_1 \leq i_2 = \text{tt}\}) \\
& = \quad \{\text{def. (18) of } \gamma \text{ and (42) of } \leq\} \\
& \text{s } \alpha^2(\{\langle i_1, i_2 \rangle \mid i_1 \in \mathbb{I} \wedge i_2 \in \mathbb{I} \wedge i_1 \leq i_2\}) \\
& = \quad \{\text{componentwise definition of } \alpha^2\} \\
& \langle \alpha(\mathbb{I}), \alpha(\mathbb{I}) \rangle
\end{aligned}$$



```

=      {def. (17) of  $\alpha$ }
      (INI, INI)
 $\stackrel{\text{def}}{=} \quad \{ \text{def. (43) of } \tilde{<} \}$ 
 $\tilde{<}(\text{TOP}, \text{TOP}) .$ 

```

□



```

199 (* avalues.ml *)
200 open Values
201 (* abstraction of sets of machine integers by initialization *)
202 (* and simple sign *)
203 (* complete lattice *)
204 type t = BOT | NEG | ZERO | POS | INI | ERR | TOP
205 (* \gamma(BOT) = {_0_(a)} *)
206 (* \gamma(NEG) = [min_int,-1] U {_0_(a)} *)
207 (* \gamma(POS) = [1,max_int] U {_0_(a)} *)
208 (* \gamma(ZERO) = {0, _0_(a)} *)
209 (* \gamma(INI) = [min_int,max_int] U {_0_(a)} *)
210 (* \gamma(ERR) = {_0_(i)} *)
211 (* \gamma(TOP) = [min_int,max_int] U {_0_(a),_0_(i)} *)
212 (* infimum *)
213 let bot () = BOT
214 (* bottom is emptyset? *)
215 let isbotempty () = false (* \gamma(BOT) = {_0_(a)} <> \emptyset *)
216 ...
217 (* boolean expressions *)

```



Implementation of the abstract arithmetic comparison operations for the initialization and simple sign analysis

```

191 (* avalues.mli *)
192 (* abstraction of sets of machine integers by initialization *)
193 (* and simple sign *)
194 type t
195 ...
196 (* abstract interpretation of boolean expressions *)
197 val a_EQ      : t -> t -> t * t
198 val a_LT      : t -> t -> t * t

```



```

218 let a_EQ p1 p2 =
219   let p = (meet p1 (meet p2 (f_RANDOM ()))) in
220   (p,p)
221 let a_LT_table = [
222 (* < BOT NEG ZERO POS INI ERR TOP *)
223 (*BOT*) [| (BOT,BOT); (BOT,BOT); (BOT,BOT) ; (BOT,BOT) ; (BOT,BOT) ; (BOT,BOT); (BOT,BOT) |];
224 (*NEG*) [| (BOT,BOT); (NEG,NEG); (NEG,ZERO); (NEG,POS) ; (NEG,INI) ; (BOT,BOT); (NEG,INI) |];
225 (*ZERO*) [| (BOT,BOT); (BOT,BOT); (BOT,BOT) ; (ZERO,POS); (ZERO,POS); (BOT,BOT); (ZERO,POS) |];
226 (*POS*) [| (BOT,BOT); (BOT,BOT); (BOT,BOT) ; (POS,POS); (POS,POS) ; (BOT,BOT); (POS,POS) |];
227 (*INI*) [| (BOT,BOT); (NEG,NEG); (NEG,ZERO); (INI,POS) ; (INI,INI) ; (BOT,BOT); (INI,INI) |];
228 (*ERR*) [| (BOT,BOT); (BOT,BOT); (BOT,BOT) ; (BOT,BOT) ; (BOT,BOT) ; (BOT,BOT); (BOT,BOT) |];
229 (*TOP*) [| (BOT,BOT); (NEG,NEG); (NEG,ZERO); (INI,POS) ; (INI,INI) ; (BOT,BOT); (INI,INI) |]
230 |]
231 let a_LT u v = select a_LT_table u v

```



Back to the motivating example



Local decreasing iterations



```
% cd Initialization-Simple-Sign-FB% cd Initialization-Simple-Sign-FB
% ./a.out ../Examples/example13.sil% ./a.out ../Examples/example14.sil
{ y:ERR; r:ERR } { y:ERR; r:ERR }
0: 0:
  y := ?; y := ?;
1: 1:
  if (y = 0) then if (y = 0) then
    2: 2:
      r := 0 r := y
    3: 3:
      else {(y < 0) | (0 < y)} else {(y < 0) | (0 < y)}
    4: 4:
      r := 0 r := 0
    5: 5:
  fi fi
6: 6:
{ y:INI; r:ZERO } { y:INI; r:ZERO }
```



Motivating example

```
% cd Initialization-Simple-Sign-FB
% ./a.out ../Examples/example15.sil
0: { x:ERR; y:ERR; z:ERR; r:ERR }
  x := 0; y := ?; z := ?;
  if ((x = y) & (y = z)) then
    4:
      r := z
    5:
  else {((x < y) | (y < x)) | ((y < z) | (z < y))}
    6:
      r := 0
    7:
  fi
8: { x:ZERO; y:INI; z:INI; r:INI }
```



- In this example, the test $(x = y)$ yields the information that $y = 0$. Independently, the test $(y = z)$ brings no new information, on y and z . The conjunction is

$$\{ x:\text{ZERO}; y:\text{ZERO}; z:\text{INI}; r:\text{TOP} \}$$

- The same analysis, starting from this valid information yields $z = 0$.
- More generally, the analysis of the tests should be iterated until no new information can be brought in.
- The idea is formalized by noticing that the analysis of tests is a lower closure operator.



- In particular, for $y = \alpha \circ \rho \circ \gamma(z)$, we have $\forall z \in Q : \alpha \circ \rho \circ \gamma(\alpha \circ \rho \circ \gamma(z)) \sqsubseteq \alpha \circ \rho \circ \gamma(z)$ hence $\alpha \circ \rho \circ \gamma \circ \alpha \circ \rho \circ \gamma \sqsubseteq \alpha \circ \rho \circ \gamma$
- Moreover

$$\rho \circ \gamma \leq \gamma \circ \alpha \circ \rho \circ \gamma \quad \{\gamma \circ \alpha \text{ is extensive}\}$$

$$\rho \circ \rho \circ \gamma \leq \rho \circ \gamma \circ \alpha \circ \rho \circ \gamma \quad \{\rho \text{ is monotone}\}$$

$$\rho \circ \gamma \leq \rho \circ \gamma \circ \alpha \circ \rho \circ \gamma \quad \{\rho \text{ is idempotent}\}$$

$$\alpha \circ \rho \circ \gamma \sqsubseteq \alpha \circ \rho \circ \gamma \circ \alpha \circ \rho \circ \gamma \quad \{\alpha \text{ monotone}\}$$

- By antisymmetry, we conclude that $\alpha \circ \rho \circ \gamma = \alpha \circ \rho \circ \gamma \circ \alpha \circ \rho \circ \gamma$ □



A theorem on the composition of lower closure operators and Galois connections

THEOREM. If $\langle P, \leq \rangle \xleftrightarrow[\alpha]{\gamma} \langle Q, \sqsubseteq \rangle$ and ρ is a lower closure operator on P (monotone, idempotent and reductive) then $\alpha \circ \rho \circ \gamma$ is a lower closure operator on Q . ■

PROOF. - Since $\alpha \circ \rho \circ \gamma$ is the composition of monotone operators, it is monotone

- Since ρ is reductive i.e. $\forall x \in P : \rho(x) \leq x$, we have in particular $\forall y \in Q : \rho(\gamma(y)) \leq \gamma(y)$ whence by monotony $\forall y \in Q : \alpha(\rho(\gamma(y))) \sqsubseteq \alpha(\gamma(y)) \sqsubseteq y$ since $\alpha \circ \gamma$ is reductive in a Galois connection. By transitivity, *forally* $\in Q : \alpha \circ \rho \circ \gamma(y) \sqsubseteq y$ proving $\alpha \circ \rho \circ \gamma$ to be reductive.



Abstraction of lower closure operators

- This theorem shows that whenever we have a lower closure operator in the concrete (e.g. the analysis of boolean expressions) then its abstraction $\alpha \circ \rho \circ \gamma$ is also a lower closure operator in the abstract
- Therefore, the abstract interpretation $\bar{\rho}$ of the operator $\alpha \circ \rho \circ \gamma \sqsubseteq \bar{\rho}$ can always be chosen to be a lower closure operator
- In this case, if $\bar{\rho}$ is not the best abstraction of ρ , that is $\alpha \circ \rho \circ \gamma \sqsubset \bar{\rho}$, $\bar{\rho}$ can be improved by *local decreasing iterations* [1].

References

- [1] Philippe Granger. "Improving the Results of Static Analyses Programs by Local Decreasing Iteration". FSTTCS 1992: 68-79.



Local decreasing iterations

THEOREM. If $\langle M, \preceq \rangle$ is poset, $f \in M \mapsto M$ is monotone and idempotent, $\langle M, \preceq \rangle \xrightarrow[\alpha]{\gamma} \langle L, \sqsubseteq \rangle$ is a Galois connection, $\langle L, \sqsubseteq, \sqcap \rangle$ is a dual dcpo, $g \in L \mapsto L$ is monotone and reductive and $\alpha \circ f \circ \gamma \sqsubseteq g$ then the lower closure operator $g^* \stackrel{\text{def}}{=} \lambda x. \mathbf{gfp}_x \sqsubseteq g$ is a better abstract interpretation of f than g

$$\alpha \circ f \circ \gamma \sqsubseteq g^* \sqsubseteq g.$$

■



$$\begin{aligned} &\sqsubseteq \quad \{\alpha \circ f \circ \gamma \sqsubseteq g \text{ hypothesis}\} \\ &g(g^\delta(x)) \\ = &\quad \{\text{def. } g^{\delta+1}(x)\} \\ &g^{\delta+1}(x). \end{aligned}$$

If $\alpha \circ f \circ \gamma(x) \sqsubseteq g^\delta(x)$ for all $\delta < \lambda$ and λ is a limit ordinal then by definition of lubs and g^λ , we have $\alpha \circ f \circ \gamma(x) \sqsubseteq \prod_{\delta < \lambda} g^\delta(x) = g^\lambda$. By transfinite induction, $\alpha \circ f \circ \gamma(x) \sqsubseteq g^\epsilon(x) = g^*(x)$. □

Note: when $\langle L, \sqsubseteq \rangle$ does not satisfy the decreasing chain condition then a narrowing must be used to ensure convergence.



PROOF. For all $x \in L$, $g(x) \sqsubseteq x$, so that by monotony the sequence $g^0(x) \stackrel{\text{def}}{=} x$, $g^{\delta+1}(x) \stackrel{\text{def}}{=} g(g^\delta(x))$ for all successor ordinals $\delta + 1$ and $g^\lambda \stackrel{\text{def}}{=} \prod_{\delta < \lambda} g^\delta(x)$ for all limit ordinals λ is a well-defined decreasing chain in the dual dcpo $\langle L, \sqsubseteq, \sqcap \rangle$ whence ultimately stationary. It converges to g^ϵ where ϵ is the order of g , which is the greatest fixpoint $g^\epsilon = \mathbf{gfp}_x \sqsubseteq g$ of g which is \sqsubseteq -less than x . It follows that $g^* \stackrel{\text{def}}{=} \mathbf{gfp}_x \sqsubseteq g$ is the greatest lower closure operator \sqsubseteq -less than g . In particular $g^* \sqsubseteq g$.

We have $\alpha \circ f \circ \gamma(x) \sqsubseteq g^1(x) = g(x) \sqsubseteq x = g^0(x)$. If $\alpha \circ f \circ \gamma(x) \sqsubseteq g^\delta(x)$ then

$$\begin{aligned} &\alpha \circ f \circ \gamma(x) \\ = &\quad \{f \text{ idempotent}\} \\ &\alpha \circ f \circ \gamma \circ \alpha \circ f \circ \gamma(x) \\ \sqsubseteq &\quad \{\alpha \circ f \circ \gamma(x) \sqsubseteq g^\delta(x) \text{ by induction hypothesis, } \gamma, f \text{ and } \alpha \text{ are} \\ &\quad \text{monotone}\} \\ &\alpha \circ f \circ \gamma(g^\delta(x)) \end{aligned}$$



The forward/bottom-up collecting semantics of boolean expressions is a lower closure operator

Recall the *collecting semantics* $\mathbf{Cbexp}[[B]]R$ of a boolean expression B from course 8:

$$\mathbf{Cbexp}[[B]]R \stackrel{\text{def}}{=} \{\rho \in R \mid \rho \vdash B \Rightarrow \text{tt}\}. \quad (44)$$

THEOREM. $\mathbf{Cbexp}[[B]]$ is a lower closure operator. ■



PROOF. – $\text{Cbexp}[[B]]$ is monotone: if $R_1 \subseteq R_2$ then $\{\rho \in R_1 \mid \rho \vdash B \Rightarrow \text{tt}\} \subseteq \{\rho \in R_2 \mid \rho \vdash B \Rightarrow \text{tt}\}$ and so $\text{Cbexp}[[B]]R_1 \subseteq \text{Cbexp}[[B]]R_2$

– $\text{Cbexp}[[B]]$ is reductive: $\text{Cbexp}[[B]]R = \{\rho \in R \mid \rho \vdash B \Rightarrow \text{tt}\} \subseteq R$

– $\text{Cbexp}[[B]]$ is idempotent: $\text{Cbexp}[[B]](\text{Cbexp}[[B]]R) = \{\rho' \in \{\rho \in R \mid \rho \vdash B \Rightarrow \text{tt}\} \mid \rho' \vdash B \Rightarrow \text{tt}\} = \{\rho' \in R \mid \rho' \vdash B \Rightarrow \text{tt}\} = \text{Cbexp}[[B]]R$

□



parameterized by the following forward abstract operations

$$n^\triangleright = \alpha(\{\underline{n}\}) \quad (46)$$

$$?^\triangleright \sqsupseteq \alpha(\mathbb{I}) \quad (47)$$

$$u^\triangleright(p) \sqsupseteq \alpha(\{\underline{u}v \mid v \in \gamma(p)\}) \quad (48)$$

$$b^\triangleright(p_1, p_2) \sqsupseteq \alpha(\{v_1 \underline{b} v_2 \mid v_1 \in \gamma(p_1) \wedge v_2 \in \gamma(p_2)\}) \quad (49)$$



The forward/top-down nonrelational abstract semantics of arithmetic expressions is monotone

Recall the forward/top-down nonrelational abstract semantics of arithmetic expressions

$$\begin{aligned} \text{Faexp}^\triangleright[[A]](\lambda Y. \perp) &\stackrel{\text{def}}{=} \perp && \text{if } \gamma(\perp) = \emptyset && (45) \\ \text{Faexp}^\triangleright[[n]]r &\stackrel{\text{def}}{=} n^\triangleright \\ \text{Faexp}^\triangleright[[X]]r &\stackrel{\text{def}}{=} r(X) \\ \text{Faexp}^\triangleright[[?]]r &\stackrel{\text{def}}{=} ?^\triangleright \\ \text{Faexp}^\triangleright[[u A']]r &\stackrel{\text{def}}{=} u^\triangleright(\text{Faexp}^\triangleright[[A']]r) \\ \text{Faexp}^\triangleright[[A_1 \underline{b} A_2]]r &\stackrel{\text{def}}{=} b^\triangleright(\text{Faexp}^\triangleright[[A_1]]r, \text{Faexp}^\triangleright[[A_2]]r) \end{aligned}$$



THEOREM. If $u^\triangleright \in L \xrightarrow{m} L$ and $b^\triangleright \in L \times L \xrightarrow{m} L$ then $\text{Faexp}^\triangleright[[A]]$ is monotone. ■

PROOF. – In the case $\perp \dot{\sqsubseteq} r$, we have $\text{Faexp}^\triangleright[[A]]\perp \stackrel{\text{def}}{=} \perp \sqsubseteq \text{Faexp}^\triangleright[[A]]r$

(a) If $r_1 \dot{\sqsubseteq} r_2$ then

(b) If $r_1 \dot{\sqsubseteq} r_2$ then by reflexivity $\text{Faexp}^\triangleright[[n]]r_1 \stackrel{\text{def}}{=} n^\triangleright \sqsubseteq n^\triangleright \stackrel{\text{def}}{=} \text{Faexp}^\triangleright[[n]]r_2$

(c) If $r_1 \dot{\sqsubseteq} r_2$ then by pointwise def. of $\dot{\sqsubseteq}$, we have $\text{Faexp}^\triangleright[[X]]r_1 \stackrel{\text{def}}{=} r_1(X) \sqsubseteq r_2(X) \stackrel{\text{def}}{=} \text{Faexp}^\triangleright[[X]]r_2$

(d) If $r_1 \dot{\sqsubseteq} r_2$ then by reflexivity $\text{Faexp}^\triangleright[[?]]r_1 \stackrel{\text{def}}{=} ?^\triangleright \sqsubseteq ?^\triangleright \stackrel{\text{def}}{=} \text{Faexp}^\triangleright[[?]]r_2$

(e) By induction hypothesis, $\text{Faexp}^\triangleright[[u A']]$ is monotonic and so is u^\triangleright by hypothesis whence is their composition $u^\triangleright \circ \text{Faexp}^\triangleright[[A']] \stackrel{\text{def}}{=} \text{Faexp}^\triangleright[[u A']]$

(f) By induction hypothesis, $(\text{Faexp}^\triangleright[[A_1]])$ and $(\text{Faexp}^\triangleright[[A_2]])$ are monotonic and so is b^\triangleright by hypothesis and so is their composition $\lambda r. b^\triangleright(\text{Faexp}^\triangleright[[A_1]]r, \text{Faexp}^\triangleright[[A_2]]r) \stackrel{\text{def}}{=} \lambda r. \text{Faexp}^\triangleright[[A_1 \underline{b} A_2]]r$

□



The forward/top-down nonrelational abstract semantics of boolean expressions is monotone and reductive

We have defined

$$\text{Abexp}[\![B]\!] \stackrel{\text{def}}{=} \ddot{\alpha}(\text{Cbexp}[\![B]\!]) \quad (50)$$

such that

$$\begin{aligned} \text{Abexp}[\![B]\!] \stackrel{\text{def}}{=} \dot{\perp} & \quad \text{if } \gamma(\perp) = \emptyset & (51) \\ \text{Abexp}[\![\text{true}]\!]r & \stackrel{\text{def}}{=} r \\ \text{Abexp}[\![\text{false}]\!]r & \stackrel{\text{def}}{=} \dot{\perp} \\ \text{Abexp}[\![A_1 \text{ c } A_2]\!]r & \stackrel{\text{def}}{=} \check{c}(\text{Faexp}^\flat[\![A_1]\!]r, \text{Faexp}^\flat[\![A_2]\!]r) \\ \text{Abexp}[\![B_1 \ \& \ B_2]\!]r & \stackrel{\text{def}}{=} \text{Abexp}[\![B_1]\!]r \dot{\cap} \text{Abexp}[\![B_2]\!]r \\ \text{Abexp}[\![B_1 \ | \ B_2]\!]r & \stackrel{\text{def}}{=} \text{Abexp}[\![B_1]\!]r \dot{\cup} \text{Abexp}[\![B_2]\!]r \end{aligned}$$



parameterized by the following abstract comparison operations $\check{c}, c \in \{<, =\}$ on L

$$\begin{aligned} \check{c}(p_1, p_2)r & \stackrel{\text{def}}{=} (\check{B}(p_1, p_2) ? r : \dot{\perp}) & (52) \\ \check{B}(p_1, p_2) & \implies \exists v_1 \in \gamma(p_1) : \exists v_2 \in \gamma(p_2) \cap \mathbb{I} : v_1 \sqsubseteq v_2 = \text{tt} \end{aligned}$$

THEOREM. $\text{Abexp}[\![B]\!]$ is reductive and if $\check{B} \in \langle L, \sqsubseteq \rangle \times \langle L, \sqsubseteq \rangle \xrightarrow{\text{m}} \langle \mathbb{B}, \implies \rangle$ is monotonic then $\text{Abexp}[\![B]\!]$ is monotonic. \blacksquare

PROOF. — $\text{Abexp}[\![B]\!]$ is reductive. The proof is by structural induction on B .

- (a) For the infimum $\dot{\perp} \stackrel{\text{def}}{=} \dot{\perp} \stackrel{\text{def}}{=} \text{Abexp}[\![B]\!] \dot{\perp}$
- (b) By reflexivity $r \stackrel{\text{def}}{=} r \stackrel{\text{def}}{=} \text{Abexp}[\![\text{true}]\!]r$
- (c) For the infimum $r \stackrel{\text{def}}{=} \dot{\perp} \stackrel{\text{def}}{=} \text{Abexp}[\![\text{false}]\!]r$



- (d) If $\check{B}(p_1, p_2)$ holds then $r \stackrel{\text{def}}{=} \check{c}(p_1, p_2)$. Otherwise $\neg(\check{B}(p_1, p_2))$ holds and so $r \stackrel{\text{def}}{=} \dot{\perp} \stackrel{\text{def}}{=} \check{c}(p_1, p_2)$. So $\check{c}(p_1, p_2)$ is reductive for all p_1 and p_2 and so in particular $\text{Abexp}[\![A_1 \text{ c } A_2]\!]r \stackrel{\text{def}}{=} \check{c}(\text{Faexp}^\flat[\![A_1]\!]r, \text{Faexp}^\flat[\![A_2]\!]r)$ is reductive
 - (e) By induction hypothesis, $\text{Abexp}[\![B_1]\!]r \stackrel{\text{def}}{=} r$ and $\text{Abexp}[\![B_2]\!]r \stackrel{\text{def}}{=} r$ so $\text{Abexp}[\![B_1 \ \& \ B_2]\!]r \stackrel{\text{def}}{=} \text{Abexp}[\![B_1]\!]r \dot{\cap} \text{Abexp}[\![B_2]\!]r \stackrel{\text{def}}{=} r \dot{\cap} r = r$ by def. glb
 - (f) Similarly, $\text{Abexp}[\![B_1 \ | \ B_2]\!]r \stackrel{\text{def}}{=} \text{Abexp}[\![B_1]\!]r \dot{\cup} \text{Abexp}[\![B_2]\!]r \stackrel{\text{def}}{=} r \dot{\cup} r = r$ by ind. hyp. and def. lub.
- $\text{Abexp}[\![B]\!]$ is monotone. The proof is by structural induction on B .
- (a) if $\dot{\perp} \stackrel{\text{def}}{=} \dot{\perp} \stackrel{\text{def}}{=} \text{Abexp}[\![B]\!]r$
 - (b) $\text{Abexp}[\![\text{true}]\!]$ is the identity, which is monotone
 - (c) $\text{Abexp}[\![\text{false}]\!]$ is a constant function, which is monotone
 - (d) If $r_1 \stackrel{\text{def}}{=} r_2$ then $\text{Faexp}^\flat[\![A_i]\!]r_1 \stackrel{\text{def}}{=} \text{Faexp}^\flat[\![A_i]\!]r_2$ since $\text{Faexp}^\flat[\![A_i]\!]r, i = 1, 2$ has been shown to be monotone. It follows by monotony of \check{B} that if $r_1 \stackrel{\text{def}}{=} r_2$ then $\check{B}(\text{Faexp}^\flat[\![A_1]\!]r_1, \text{Faexp}^\flat[\![A_2]\!]r_1) \implies \check{B}(\text{Faexp}^\flat[\![A_1]\!]r_2, \text{Faexp}^\flat[\![A_2]\!]r_2)$ and so, by cases:



- If $\check{B}(\text{Faexp}^\flat[\![A_1]\!]r_1, \text{Faexp}^\flat[\![A_2]\!]r_1) = \text{tt}$ then $\check{B}(\text{Faexp}^\flat[\![A_1]\!]r_2, \text{Faexp}^\flat[\![A_2]\!]r_2) = \text{tt}$ in which case $\text{Abexp}[\![A_1 \ \& \ A_2]\!]r_1 \stackrel{\text{def}}{=} \check{c}(\text{Faexp}^\flat[\![A_1]\!]r_1, \text{Faexp}^\flat[\![A_2]\!]r_1) = r_1 \stackrel{\text{def}}{=} r_2 = \check{c}(\text{Faexp}^\flat[\![A_1]\!]r_2, \text{Faexp}^\flat[\![A_2]\!]r_2) \stackrel{\text{def}}{=} \text{Abexp}[\![A_1 \ \& \ A_2]\!]r_2$
 - Otherwise, $\check{B}(\text{Faexp}^\flat[\![A_1]\!]r_1, \text{Faexp}^\flat[\![A_2]\!]r_1) = \text{ff}$ and so $\text{Abexp}[\![A_1 \ \& \ A_2]\!]r_1 \stackrel{\text{def}}{=} \check{c}(\text{Faexp}^\flat[\![A_1]\!]r_1, \text{Faexp}^\flat[\![A_2]\!]r_1) = \dot{\perp} \stackrel{\text{def}}{=} r_2 = \check{c}(\text{Faexp}^\flat[\![A_1]\!]r_2, \text{Faexp}^\flat[\![A_2]\!]r_2) \stackrel{\text{def}}{=} \text{Abexp}[\![A_1 \ \& \ A_2]\!]r_2$
- (e,f) By induction hypothesis, $\text{Abexp}[\![B_1]\!]$ and $\text{Abexp}[\![B_2]\!]$ are monotone, as well as $\dot{\cap}$ and $\dot{\cup}$ and so are their composition $\text{Abexp}[\![B_1]\!]r \dot{\cap} \text{Abexp}[\![B_2]\!]r \stackrel{\text{def}}{=} \text{Abexp}[\![B_1 \ \& \ B_2]\!]r$ and $\text{Abexp}[\![B_1]\!]r \dot{\cup} \text{Abexp}[\![B_2]\!]r \stackrel{\text{def}}{=} \text{Abexp}[\![B_1 \ | \ B_2]\!]r$

□



Reductive iterations for boolean expressions

Reductive iteration has a direct application to the analysis of boolean expressions. The abstract interpretation $\text{Abexp}[[B]]$ (12) of boolean expressions B can always be replaced by its reductive iteration $\text{Abexp}[[B]]^*$ which is sound (11) and always more precise. By the local decreasing iterations Th. (page 85), we have

$$\ddot{\alpha}(\text{Cbexp}[[B]]) \sqsubseteq \text{Abexp}[[B]]^* \sqsubseteq \text{Abexp}[[B]].$$

PROOF. – $\text{Cbexp}[[B]]$ is a lower closure operator

- $\text{Abexp}[[B]]$ is monotone and reductive (but not idempotent as shown for the motivating example)
- So $\text{Abexp}[[B]]^* = \lambda x. \text{gfp}_x \sqsubseteq \text{Abexp}[[B]]x$ is a better abstraction of $\text{Cbexp}[[B]]$ than $\text{Abexp}[[B]]$



```
245   let x' = (f x) in
246     if (c x' x) then x'
247     else lfp x' c f
248 (* gfp x c f : iterative computation of the c-greatest fixpoint of *)
249 (* f, c-less than or equal to the postfixpoint x (f(x) <= x)      *)
250 let gfp x c f =
251   let c_1 a b = c b a in
252     lfp x c_1 f
253 (* abexp.ml *)
254 open Abstract_Syntax
255 open Fixpoint
256 (* abstract interpretation of boolean operations with iterative *)
257 (* reduction                                                    *)
258 let rec a_bexp' b r =
259   match b with
260   | TRUE       -> r
261   | FALSE      -> (Aenv.bot ())
262   | EQ (a1, a2) ->
```



Implementation of the reductive iterations for abstract interpretation of boolean expressions

```
232 (* fixpoint.mli *)
233 open Aenv
234 (* lfp x c f : iterative computation of the c-least fixpoint of f *)
235 (* c-greater than or equal to the prefixpoint x (f(x) >= x)      *)
236 val lfp : t -> (t -> t -> bool) -> (t -> t) -> t
237 (* gfp x c f : iterative computation of the c-greatest fixpoint *)
238 (* of f c-less than or equal to the postfixpoint x (f(x) <= x)  *)
239 val gfp : t -> (t -> t -> bool) -> (t -> t) -> t
240 (* fixpoint.ml *)
241 open Aenv
242 (* lfp x c f : iterative computation of the c-least fixpoint of f *)
243 (* c-greater than or equal to the prefixpoint x (f(x) >= x)      *)
244 let rec lfp x c f =
```



```
263   let (p1,p2) = (Avalues.a_EQ (Aaexp.a_aexp a1 r) (Aaexp.a_aexp a2 r))
264     in (Aenv.meet (Baexp.b_aexp a1 r p1) (Baexp.b_aexp a2 r p2))
265   | LT (a1, a2) ->
266     let (p1,p2) = (Avalues.a_LT (Aaexp.a_aexp a1 r) (Aaexp.a_aexp a2 r))
267       in (Aenv.meet (Baexp.b_aexp a1 r p1) (Baexp.b_aexp a2 r p2))
268   | AND (b1, b2) -> (Aenv.meet (a_bexp' b1 r) (a_bexp' b2 r))
269   | OR (b1, b2) -> (Aenv.join (a_bexp' b1 r) (a_bexp' b2 r))
270 let a_bexp b r =
271   if (Aenv.is_bot r) & (Avalues.isbotempty ()) then (Aenv.bot ())
272   else gfp r Aenv.leq (a_bexp' b)
```



Motivating example ... revisited

```
% cd Initialization-Simple-Sign-FB-LDI-B
% ./a.out ../Examples/example15.sil
0: { x:ERR; y:ERR; z:ERR; r:ERR }
  x := 0; y := ?; z := ?;
  if ((x = y) & (y = z)) then
    4:
      r := z
    5:
  else {(((x < y) | (y < x)) | ((y < z) | (z < y)))}
    6:
      r := 0
    7:
  fi
8: { x:ZERO; y:INI; z:INI; r:ZERO }
```



Motivating example

```
% cd Initialization-Simple-Sign-FB-LDI-B
% ./a.out ../Examples/example18.sil
{ x:ERR; y:ERR }
0:
  x := ?;
1:
  y := (1 / x)
2:
{ x:INI; y:INI }
```



Improving the non-relational
analysis of assignments using the
backward analysis of its
righthandside arithmetic expression



Although the program execution is blocked at line 1:
when $x \leq 0$ (the division requires its second argument
to be strictly positive), this fact is not taken into account
at line 2: since the abstract assignment

$$\text{Acom}[X := A]R(\text{after}_P[X := A]) = R[X := \text{Faexp}[A](R) \sqcap ?^*]$$

does not restricts the values of variables (other than X)
in environment R to those for which the expression A is
well-defined. (its values belonging to \mathbb{I} , which excludes
those errors for which the execution stops).



Revisiting the forward/bottom-up nonrelational abstract interpretation of assignments using the backward analysis of arithmetic expressions

By restricting the values of the variables to those for which the expression A is well-defined, (its values belonging to \mathbb{I} , which excludes those errors for which the execution stops), we get

THEOREM.

$$\begin{aligned} \text{Rcom}[X := A]R(\text{after}_P[X := A]) &= \\ \text{Rcom}[X := A](\text{Baexp}[A](R)\mathbb{I})(\text{after}_P[X := A]) & \end{aligned}$$



THEOREM.

$$\begin{aligned} \alpha[X := A](\text{Rcom}[X := A]R(\text{after}_P[X := A])) &\sqsubseteq \\ \text{Acom}[X := A](\text{Baexp}[A](R)?) &(\text{after}_P[X := A]) \end{aligned}$$

PROOF. By (13), we have $\alpha[X := A](\text{Rcom}[X := A]) \stackrel{\dot{\sqsubseteq}}{\sqsubseteq} \text{Acom}[X := A]$ whence by def. (9) of $\alpha[X := A]\varphi \stackrel{\text{def}}{=} \lambda r. \lambda \ell. \dot{\alpha}(\varphi(\dot{\gamma}(r))(\ell))$, we have for all r and ℓ , $\dot{\alpha}(\text{Rcom}[X := A](\dot{\gamma}(r))(\ell)) \sqsubseteq \text{Acom}[X := A](r)\ell$. In particular for $r = \text{Baexp}[A](r')?$, we get $\forall r' : \forall \ell : \dot{\alpha}(\text{Rcom}[X := A](\dot{\gamma}(\text{Baexp}[A](r')?))(\ell)) \sqsubseteq \text{Acom}[X := A](r)\ell$.

By (33), we have $\dot{\alpha}(\text{Baexp}[A]) \stackrel{\dot{\sqsubseteq}}{\sqsubseteq} \text{Baexp}[A]$ so that by def. (32) of $\dot{\alpha}(\dot{\Phi}) \stackrel{\text{def}}{=} \lambda r. \lambda p. \dot{\alpha}(\dot{\Phi}(\dot{\gamma}(r))\gamma(p))$, we have $\forall r : \forall p : \dot{\alpha}(\text{Baexp}[A](\dot{\gamma}(r))\gamma(p)) \sqsubseteq \text{Baexp}[A](r)p$ whence for $p = ?$ such that $\gamma(?) \stackrel{\text{def}}{=} \mathbb{I}$ we get $\forall r : \dot{\alpha}(\text{Baexp}[A](\dot{\gamma}(r))\mathbb{I}) \sqsubseteq \text{Baexp}[A](r)?$. It follows, by the Galois connection property (4), that $\forall r' : \text{Baexp}[A](\dot{\gamma}(r'))\mathbb{I} \sqsubseteq \dot{\gamma}(\text{Baexp}[A](r')?)$.



PROOF.

$$\begin{aligned} &\text{Rcom}[X := A]R(\text{after}_P[X := A]) \\ &= \{\rho[X := i] \mid \rho \in R \wedge i \in (\text{Faexp}[A]\{\rho\}) \cap \mathbb{I}\} \quad \text{\textit{def. Rcom}} \\ &= \{\rho[X := i] \mid \rho \in R \wedge \rho \vdash A \Rightarrow i \wedge i \in \mathbb{I} \wedge i \in (\text{Faexp}[A]\{\rho\}) \cap \mathbb{I}\} \quad \text{\textit{def. (1) of}} \\ &\quad \text{Faexp}[A]R \stackrel{\text{def}}{=} \{v \mid \exists \rho \in R : \rho \vdash A \Rightarrow v\}} \\ &= \{\rho[X := i] \mid \rho \in R \wedge \exists j \in \mathbb{I} : \rho \vdash A \Rightarrow j \wedge i \in (\text{Faexp}[A]\{\rho\}) \cap \mathbb{I}\} \\ &= \{\rho[X := i] \mid \rho \in \{\rho' \in R \mid \exists j \in \mathbb{I} \cap \mathbb{I} : \rho \vdash A \Rightarrow j\} \wedge i \in (\text{Faexp}[A]\{\rho\}) \cap \mathbb{I}\} \\ &= \{\rho[X := i] \mid \rho \in \text{Baexp}[A](R)\mathbb{I} \wedge i \in (\text{Faexp}[A]\{\rho\}) \cap \mathbb{I}\} \quad \text{\textit{def. (19) of}} \\ &\quad \text{Baexp}[A](R)P \stackrel{\text{def}}{=} \{\rho \in R \mid \exists i \in P \cap \mathbb{I} : \rho \vdash A \Rightarrow i\}} \\ &= \text{Rcom}[X := A](\text{Baexp}[A](R)\mathbb{I})(\text{after}_P[X := A]) \quad \text{\textit{def. Rcom}} \end{aligned}$$

In the abstract, we have:



It follows by monotony of $\dot{\alpha}$ and $\text{Rcom}[X := A]$ that $\dot{\alpha}(\text{Rcom}[X := A](\text{Baexp}[A](\dot{\gamma}(r'))\mathbb{I})(\ell)) \sqsubseteq \dot{\alpha}(\text{Rcom}[X := A](\dot{\gamma}(\text{Baexp}[A](r')?))(\ell))$ and so we conclude

$$\begin{aligned} &\alpha[X := A](\text{Rcom}[X := A]R(\text{after}_P[X := A])) \\ &= \dot{\alpha}(\text{Rcom}[X := A](\dot{\gamma}(R))(\text{after}_P[X := A])) \quad \text{\textit{by def (9) of } } \alpha[C]\varphi \stackrel{\text{def}}{=} \\ &\quad \lambda r. \lambda \ell. \dot{\alpha}(\varphi(\dot{\gamma}(r))(\ell)) \\ &= \dot{\alpha}(\text{Rcom}[X := A](\text{Baexp}[A](\dot{\gamma}(R))\mathbb{I})(\text{after}_P[X := A])) \quad \text{\textit{by previous}} \\ &\quad \text{\textit{theorem}} \\ &\sqsubseteq \dot{\alpha}(\text{Rcom}[X := A](\dot{\gamma}(\text{Baexp}[A](R)?)?)(\text{after}_P[X := A])) \quad \text{\textit{as shown above}} \\ &\sqsubseteq \alpha[X := A](\text{Rcom}[X := A](\text{Baexp}[A](R)?)?)(\text{after}_P[X := A])) \quad \text{\textit{def.}} \\ &\quad \alpha[X := A] \\ &\sqsubseteq \text{Acom}[X := A](\text{Baexp}[A](R)?)?(\text{after}_P[X := A])) \quad \text{\textit{by (13) so that}} \\ &\quad \alpha[C](\text{Rcom}[C]) \stackrel{\dot{\sqsubseteq}}{\sqsubseteq} \text{Acom}[C] \end{aligned}$$



Implementation of the revisited forward/bottom-up nonrelational abstract interpretation of assignments using the backward analysis of arithmetic expressions

```

273 (* acom.ml *)
274 open Abstract_Syntax
275 open Labels
276 open Aenv
277 open Aaexp
278 open Abexp
279 open Fixpoint
280 open Baexp
281 (* forward abstract semantics of commands *)
282

```



```

301     else if (incom l f) then
302       (acom f (a_bexp nb r) l)
303     else if (l = l'') then
304       (join (acom t (a_bexp b r) (after t))
305            (acom f (a_bexp nb r) (after f)))
306     else (raise (Error "IF incoherence"))
307 | (WHILE (l', b, nb, c', l'')) ->
308   let f x = join r (acom c' (a_bexp b x) (after c'))
309   in let i = lfp (bot ()) leq f in
310     (if (l = l') then i
311      else if (incom l c') then (acom c' (a_bexp b i) l)
312      else if (l = l'') then (a_bexp nb i)
313      else (raise (Error "WHILE incoherence")))
314 and acomseq s r l = match s with
315 | [] -> raise (Error "empty SEQ incoherence")
316 | [c] -> if (incom l c) then (acom c r l)
317          else (raise (Error "SEQ incoherence"))
318 | h::t -> if (incom l h) then (acom h r l)

```



```

283 exception Error of string
284 let rec acom c r l =
285   match c with
286   | (SKIP (l', l'')) ->
287     if (l = l') then r
288     else if (l = l'') then r
289     else (raise (Error "SKIP incoherence"))
290   | (ASSIGN (l', x, a, l'')) ->
291     if (l = l') then r
292     else if (l = l'') then
293       f_ASSIGN x (a_aexp a) (b_aexp a r (Avalues.f_RANDOM ()))
294     else (raise (Error "ASSIGN incoherence"))
295   | (SEQ (l', s, l'')) ->
296     (acomseq s r l)
297   | (IF (l', b, nb, t, f, l'')) ->
298     (if (l = l') then r
299      else if (incom l t) then
300        (acom t (a_bexp b r) l)

```



```

319     else (acomseq t (acom h r (after h)) l)
320

```



Motivating example ... revisited

```
% cd Initialization-Simple-Sign-FB-LDI-BA
% ./a.out ../Examples/example18.sil
{ x:ERR; y:ERR }
0:
  x := ?;
1:
  y := (1 / x)
2:

{ x:POS; y:INI }
```



Bibliography

- [2] P. Cousot. "The Computational Design of a Generic Abstract Interpreter". In M. Broy and R. Steinbrüggen (eds.): *Computational System Design*. NATO ASI Series F. Amsterdam: IOS Press, 1999.
- [3] P. Cousot. "The Marktoberdorf'98 Generic Abstract Interpreter". <http://www.di.ens.fr/~cousot/Marktoberdorf98.shtml>.



Personal project: homework 2

- Change `fileavalues.ml` of the non-relational initialization and simple sign abstract interpreters with backward analysis of expressions discussed in this lecture to implement the finitary analysis that you have chosen.



THE END

My MIT web site is <http://www.mit.edu/~cousot/>

The course web site is <http://web.mit.edu/afs/athena.mit.edu/course/16/16.399/www/>.

