Lazy Abstraction & Spatial Interpolant

Reporter: Xie Li

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Papers

- Lazy Abstraction with Interpolants. CAV'06
- Spatial Interpolants. ESOP'15

Example: Lazy Abstraction with Interpolants

```
do{
    lock();
    old = new;
    if(*) {
        unlock;
        new++;
    }
} while (new != old);
ERR

L=0;
L=1;
old=new
[new!=old]

(b) control-flow graph
```

L is the variable for lock, locked if L=1.

Prove: L is always 0 on entry to lock.

- Unwind the program into a tree, and label the true statements for each tree node.
- Find a labeling that root is True and error states are False.

Interpolants

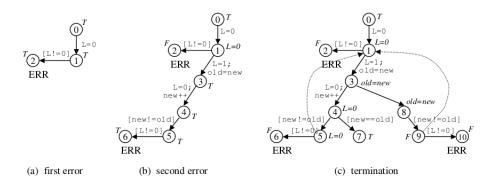
An interpolant for (A, B) is a formula A' s.t.

- \bullet $A \rightarrow A'$
- $A' \wedge B$ is unsatisfiable and
- $A' \in \mathcal{L}(A) \cap \mathcal{L}(B)$

We say A_0', \ldots, A_n' is an interpolant for $\Gamma = A_1, \ldots, A_n$ when

- $A'_0 = \text{True}, A'_n = \text{False}$
- For all $1 \le i \le n, A'_{i-1} \land A_i \implies A'_i$
- For all $1 \leq i < n, A_i' \in \mathcal{L}(A_1 \dots A_i) \cap \mathcal{L}(A_{i+1} \dots A_n)$

Example: Unwinding



Dashed arrow represents the covering relation \triangleright . e.g. $(5,1) \in \triangleright$.

Formalization: Program

- A program is a tuple $(\Gamma, \Delta, l_i, l_f)$. e.g. $(l, T, m) \in \Delta$, and T is a transition formula.
- A path π : $(l_0, T_0, l_1), (l_1, T_1, l_2), \dots, (l_{n-1}, T_{n-1}, l_n)$. Error path.
- The unfolding $\mathcal{U}(\pi)$ of a path: $T_0^{\langle 0 \rangle}, \dots, T_n^{\langle n-1 \rangle}$
- Inductive invariant: $I: \Lambda \to \mathcal{L}(S)$, s.t. $I(l_i) = \text{True}$ and for every $(l, T, m) \in \Delta$, $I(l) \wedge T \to I(m)'$.
- ullet Safety invariant: An inductive invariant I s.t. $I(l_f)={\sf False}.$

Formalization: Unwinding

Program unwindings We now give a definition of a program unwinding, and an algorithm to construct a complete unwinding using interpolants. For two vertices v and w of a tree, we will write $w \sqsubset v$ when w is a proper ancestor of v.

Definition 1. An unwinding of a program $A = (\Lambda, \Delta, l_i, l_f)$ is a quadruple (V, E, M_v, M_e) , where (V, E) is a directed tree rooted at ϵ , $M_v : V \to \Lambda$ is the vertex map, and $M_e : E \to \Delta$ is the edge map, such that:

- $-M_v(\epsilon)=l_i$
- for every non-leaf vertex $v \in V$, for every action $(M_v(v), T, m) \in \Delta$, there exists an edge $(v, w) \in E$ such that $M_v(w) = m$ and $M_e(v, w) = T$.

Formalization: Unwinding

Definition 2. A labeled unwinding of a program $\mathcal{A} = (\Lambda, \Delta, l_i, l_f)$ is a triple $(U, \psi, \triangleright)$, where

- $-U = (V, E, M_v, M_e)$ is an unwinding of A
- $-\psi: V \to \mathcal{L}(S)$ is called the vertex labeling, and
- $\triangleright \subseteq V \times V$ is called the covering relation.

A vertex $v \in V$ is said to be covered iff there exists $(w, x) \in \triangleright$ such that $w \sqsubseteq v$. The unwinding is said to be safe iff, for all $v \in V$, $M_v(v) = l_f$ implies $\psi(v) \equiv$ FALSE. It is complete iff every leaf $v \in V$ is covered.

Definition 3. A labeled unwinding $(U, \psi, \triangleright)$ of a program $\mathcal{A} = (\Lambda, \Delta, l_i, l_f)$, where $U = (V, E, M_v, M_e)$, is said to be well-labeled iff:

- $-\psi(\epsilon) \equiv \text{True}, \ and$
- for every edge $(v, w) \in E$, $\psi(v) \wedge M_e(v, w)$ implies $\psi(w)'$, and
- for all $(v, w) \in \triangleright$, $\psi(v) \Rightarrow \psi(w)$, and w is not covered.

Soundness

Theorem (Soundness)

If there exists a safe, complete, well-labeled unwinding of program $\mathcal A$, then $\mathcal A$ is safe.

Proof.

Let U be the set of uncovered vertices, and let function M map location l to $\bigvee \{\psi(v) \mid M_v(v) = l, v \in U\}$. M is a safety invariant for \mathcal{A} .

Algorithm

```
global variables: V a set, E \subseteq V \times V, \triangleright \subseteq V \times V and \psi : V \to wff
procedure Expand (v \in V):
     if v is an uncovered leaf then
          for all actions (M_v(v), T, m) \in \Delta
                add a new vertex w to V and a new edge (v, w) to E;
                set M_v(w) \leftarrow m and \psi(w) \leftarrow \text{True};
               set M_e(v, w) \leftarrow T
procedure Refine (v \in V):
     if M_v(v) = l_f and \psi(v) \not\equiv \text{False then}
          let \pi = (v_0, T_0, v_1) \cdots (v_{n-1}, T_{n-1}, v_n) be the unique path from \epsilon to v
          if \mathcal{U}(\pi) has an interpolant \hat{A}_0, \ldots, \hat{A}_n then
                for i = 0 \dots n:
                    let \phi = \hat{A}_i^{\langle -i \rangle}
                     if \psi(v_i) \not\models \phi then
                          remove all pairs (\cdot, v_i) from \triangleright
                          set \psi(v_i) \leftarrow \psi(v_i) \wedge \phi
          else abort (program is unsafe)
procedure Cover(v, w \in V):
     if v is uncovered and M_v(v) = M_v(w) and v \not\subseteq w then
          if \psi(v) \models \psi(w) then
                add (v, w) to \triangleright:
                delete all (x, y) \in \triangleright, s.t. v \sqsubseteq y;
```

Algorithm

```
procedure Close(v \in V):
    for all w \in V s.t. w \prec v and M_v(w) = M_v(v):
         Cover(v, w)
recursive procedure DFS(v \in V):
    Close(v)
    if v is uncovered then
         if M_v(v) = l_f then
              Refine(v);
              for all w \sqsubseteq v : Close(w)
         Expand(v);
         for all children w of v: DFS(w)
procedure Unwind:
    set V \leftarrow \{\epsilon\}, E \leftarrow \emptyset, \psi(\epsilon) \leftarrow \text{True}, \triangleright \leftarrow \emptyset
    while there exists an uncovered leaf v \in V:
         for all w \in V s.t. w \sqsubset v: Close(w):
         DFS(v)
```

where \prec is the relation regarding \sqsubseteq , indicating the order of computing the covering relation. Since adding a new pair may delete old pairs.

Lazy Abstraction with Spatial Interpolants

Procedure:

- Sample a program path and construct a Hoare stype proof of this path.
- Compute Spatial Interpolants
- Refine with Theory Interpolants
- From Proofs of Paths to Proofs of Programs

Example: Spatial Interpolants

```
1: int i = nondet();
                                                                                                                                                                                                                                                                                                 node* x = null:
                                                                                                                                                                                                                                                                          2: while (i != 0)
                                                                                                                                                                                                                                                                                                                node* tmp = malloc(node);
                                                                                                                                                                                                                                                                                                                tmp->N = x;
                                                                                                                                                                                                                                                                                                                 tmp->D = i;
                                                                                                                                                                                                                                                                                                                x = tmp;
                                                                                                                                                                                                                                                                                                                 i--:
                                                                                                                                                                                                                                                                          3: while (x != null)
                                                                                                                                                                                                                                                                                                                assert(x->D >= 0);
                                                                                                                                                                                                                                                                                                                x = x -> N:
                                                                                                                                                                                                              assume(i != 0);
                                                                                                                                                                                                              node* tmp = ...:
                                                                                                                                                                                                              tmp->N = x;
                                                        int i = nondet();
                                                                                                                                                                                                              tmp->D = i;
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                   assert(x->D>=0)
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                                                        node* x = null
                                                                                                                                                                                                                x = tmp; i--
                                                                                                                                                                                                                                                                                                                                   2a
(a)
                                                                                                                                                        x = null : emp
                                                                                                                                                                                                                                                                                                                                                                                                                                                                             true: x \mapsto [d', null]
              true: emp
                                                                                                                                                                                                                                                                                   true: x \mapsto [d', null]
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          true: emp
                                                                                                                                                                                                                                                                                                                                                                                                             . . .
(c)
          true : \mathsf{emp} \quad true : \mathsf{ls}((\lambda \nu. \nu \geqslant i), x, \mathsf{null}) \quad true : \mathsf{ls}((\lambda \nu. \nu \geqslant i), x, \mathsf{null}) \quad true : \mathsf{ls}((\lambda \nu. \nu \geqslant 0), x, \mathsf{null}) \quad d' \geqslant 0 : x \mapsto [d', n'] \quad true : \mathsf{ls}((\lambda \nu. \nu \geqslant 0), x, \mathsf{null}) \quad d' \geqslant 0 : x \mapsto [d', n'] \quad true : \mathsf{ls}((\lambda \nu. \nu \geqslant 0), x, \mathsf{null}) \quad d' \geqslant 0 : x \mapsto [d', n'] \quad true : \mathsf{ls}((\lambda \nu. \nu \geqslant 0), x, \mathsf{null}) \quad d' \geqslant 0 : x \mapsto [d', n'] \quad true : \mathsf{ls}((\lambda \nu. \nu \geqslant 0), x, \mathsf{null}) \quad d' \geqslant 0 : x \mapsto [d', n'] \quad true : \mathsf{ls}((\lambda \nu. \nu \geqslant 0), x, \mathsf{null}) \quad d' \geqslant 0 : x \mapsto [d', n'] \quad true : \mathsf{ls}((\lambda \nu. \nu \geqslant 0), x, \mathsf{null}) \quad d' \geqslant 0 : x \mapsto [d', n'] \quad true : \mathsf{ls}((\lambda \nu. \nu \geqslant 0), x, \mathsf{null}) \quad d' \geqslant 0 : x \mapsto [d', n'] \quad true : \mathsf{ls}((\lambda \nu. \nu \geqslant 0), x, \mathsf{null}) \quad d' \geqslant 0 : x \mapsto [d', n'] \quad true : \mathsf{ls}((\lambda \nu. \nu \geqslant 0), x, \mathsf{null}) \quad d' \geqslant 0 : x \mapsto [d', n'] \quad true : \mathsf{ls}((\lambda \nu. \nu \geqslant 0), x, \mathsf{null}) \quad d' \geqslant 0 : x \mapsto [d', n'] \quad true : \mathsf{ls}((\lambda \nu. \nu \geqslant 0), x, \mathsf{null}) \quad d' \geqslant 0 : x \mapsto [d', n'] \quad true : \mathsf{ls}((\lambda \nu. \nu \geqslant 0), x, \mathsf{null}) \quad d' \geqslant 0 : x \mapsto [d', n'] \quad true : \mathsf{ls}((\lambda \nu. \nu. \nu \geqslant 0), x, \mathsf{null}) \quad d' \geqslant 0 : x \mapsto [d', n'] \quad true : \mathsf{ls}((\lambda \nu. \nu. \nu \geqslant 0), x, \mathsf{null}) \quad d' \geqslant 0 : x \mapsto [d', n'] \quad true : \mathsf{ls}((\lambda \nu. \nu. \nu \geqslant 0), x, \mathsf{null}) \quad d' \geqslant 0 : x \mapsto [d', n'] \quad true : \mathsf{ls}((\lambda \nu. \nu. \nu \geqslant 0), x, \mathsf{null}) \quad d' \geqslant 0 : x \mapsto [d', n'] \quad true : \mathsf{ls}((\lambda \nu. \nu. \nu \geqslant 0), x, \mathsf{null}) \quad d' \geqslant 0 : x \mapsto [d', n'] \quad true : \mathsf{ls}((\lambda \nu. \nu. \nu \geqslant 0), x, \mathsf{null}) \quad d' \geqslant 0 : x \mapsto [d', n'] \quad true : \mathsf{ls}((\lambda \nu. \nu. \nu \geqslant 0), x, \mathsf{null}) \quad d' \geqslant 0 : x \mapsto [d', n'] \quad true : \mathsf{ls}((\lambda \nu. \nu. \nu \geqslant 0), x, \mathsf{null}) \quad d' \geqslant 0 : x \mapsto [d', n'] \quad true : \mathsf{ls}((\lambda \nu. \nu. \nu \geqslant 0), x, \mathsf{null}) \quad d' \geqslant 0 : x \mapsto [d', n'] \quad true : \mathsf{ls}((\lambda \nu. \nu. \nu \geqslant 0), x, \mathsf{lu}) \quad d' \geqslant 0 : x \mapsto [d', n'] \quad d' \mapsto [d
```

Preliminaries: Separation Logic

```
x, y \in \mathsf{HVar}
                                 (Heap variables)
                                                                     E, F \in \mathsf{HTerm} ::= \mathsf{null} \mid x
a, b \in \mathsf{DVar}
                                 (Data variables)
                                                                                           \mathbb{E} ::= A \mid E
                                                                              \Pi \in \mathsf{Pure} ::= true \mid E = E \mid E \neq E
A \in \mathsf{DTerm}
                                 (Data terms)
\varphi \in \mathsf{DFormula}
                                 (Data formulas)
                                                                                                       \varphi \mid \Pi \wedge \Pi
                                                                         H \in \mathsf{Heaplet} ::= \underbrace{\mathsf{true}}_{} | \mathsf{emp} | E \mapsto [\vec{A}, \vec{E}] | Z(\vec{\theta}, \vec{E})
Z \in \mathsf{RPred}
                                 (Rec. predicates)
                                                                          \Sigma \in \mathsf{Spatial} ::= H \mid H * \Sigma
\theta \in \mathsf{Refinement} ::= \lambda \vec{a}.\varphi
                                                                              P \in \mathsf{RSep} ::= (\exists X. \Pi : \Sigma)
X \subseteq \mathsf{Var}
                            ::=x\mid a
```

Fig. 4. Syntax of RSep formulas.

Features:

- General recursive predicates.
- Recursive predicates are augmented with a vector of refinements on data values.
- Each heal cell is a record consisting of data fields followed by heap fields.
- Pure formulas contain heal and first-order data constraints.

Preliminaries: Separation Logic

Separation conjunction:

$$P * Q = (\exists X_P \cup X_Q . \Pi_P \wedge \Pi_Q : \Sigma_P * \Sigma_Q)$$

We write $\exists X.P$ to denote:

$$\exists X.P = \exists X \cup X_P.\Pi_P : \Sigma_P$$

Recursive predicates:

$$\begin{split} \mathsf{ls}(R,x,y) &\equiv (x=y:\mathsf{emp}) \vee \\ &(\exists d,n'.\ x \neq y \land R(d): x \mapsto [d,n'] * \mathsf{ls}(R,n',y)) \\ \mathsf{bt}(Q,L,R,x) &= (x=\mathsf{null}:\mathsf{emp}) \\ &\vee (\exists d,l,r.\ Q(d): x \mapsto [d,l,r] \\ &\quad * \mathsf{bt}((\lambda a.Q(a) \land L(d,a)),L,R,l) \\ &\quad * \mathsf{bt}((\lambda a.Q(a) \land R(d,a)),L,R,r)) \\ \mathsf{bt}((\lambda a.true), (\lambda a,b.a \geqslant b), (\lambda a,b.a \leqslant b),x) \end{split}$$

Prelimiaries: Separation Logic

Generally

$$Z(\vec{R}, \vec{x}) \equiv (\exists X_1. \ \Pi_1 \land \Phi_1 : \Sigma_1) \lor \cdots \lor (\exists X_n. \ \Pi_n \land \Phi_n : \Sigma_n)$$

Semantic of recursive predicates:

$$s,h \models Z(\vec{\theta},\vec{E}) \iff \exists P \in cases(Z(\vec{R},\vec{x})). \ s,h \models P[\vec{\theta}/\vec{R},\vec{E}/\vec{x}]$$

Prelimiaries: Program

Program is a tuple $\langle V, E, v_i, v_e \rangle$. Each edge $e \in E$ is connected with an edge command e^c .

Assignment: $x := \mathbb{R}$ Assump Heap store: $x -> N_i := E$ Data store Heap load: $y := x -> N_i$ Data load

Assumption: assume(Π) Data store: x->D_i := A Data load: y := x->D_i Allocation: x := new(n, m)Disposal: free(x)

Phase 1: Forward Symbolic Execution

For heap statements:

```
\operatorname{exec}(\mathsf{x} := \operatorname{new}(k, l), (\exists X. \Pi : \Sigma)) = (\exists X \cup \{x', \vec{d}, \vec{n}\}, (\Pi : \Sigma)[x'/x] * x \mapsto [\vec{d}, \vec{n}])
                                               where x', \vec{d}, \vec{n} are fresh, \vec{d} = (d_1, \dots, d_k), and \vec{n} = (n_1, \dots, n_l).
\operatorname{exec}(\operatorname{free}(\mathbf{x}), (\exists X. \Pi : \Sigma * z \mapsto [\vec{d}, \vec{n}]) = (\exists X. \Pi \wedge \Pi^{\neq} : \Sigma)
                                                                            where \Pi: \Sigma * z \mapsto [\vec{d}, \vec{n}] \vdash x = z and \Pi^{\neq} is the
                                                             conjunction of all disequalities x \neq y s.t y \mapsto [.,.] \in \Sigma.
exec(x := E, (\exists X. \Pi : \Sigma)) = (\exists X \cup \{x'\}. (x = E[x'/x]) * (\Pi : \Sigma)[x'/x])
                                                                                                                                       where x' is fresh.
\operatorname{exec}(\operatorname{assume}(\Pi'), (\exists X. \Pi : \Sigma)) = (\exists X. \Pi \wedge \underline{\Pi'} : \Sigma).
\operatorname{exec}(\mathsf{x}\operatorname{->}\mathsf{N}_i := \mathsf{E}, (\exists X.\ \Pi : \Sigma * z \mapsto [\vec{d},\vec{n}])) = (\exists X.\ \Pi : \Sigma * x \mapsto [\vec{d},\vec{n}[E/n_i]])
                                                                              where i \leq |\vec{n}| and \Pi : \Sigma * z \mapsto [\vec{d}, \vec{n}] \vdash x = z.
\operatorname{exec}(\mathsf{y} := \mathsf{x} - \mathsf{N}_i, (\exists X. \Pi : \Sigma * z \mapsto [\vec{d}, \vec{n}])) =
                                                               (\exists X \cup \{y'\}. (y = n_i[y'/y]) * (\Pi : \Sigma * z \mapsto [\vec{d}, \vec{n}])[y'/y])
                                                  where i \leq |\vec{n}| and \Pi : \Sigma * z \mapsto [\vec{d}, \vec{n}] \vdash x = z, and y' is fresh.
```

Phase 2: Backward Interpolation Phase

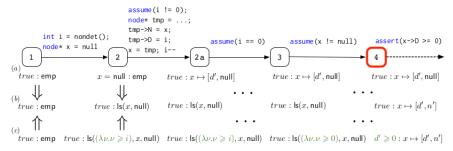
Spatial Interpolants:

Definition 1 (Spatial path interpolant). Let $\pi = e_1, \ldots, e_n$ be a program path with symbolic execution sequence S_0, \ldots, S_n , and let P be a Sep formula (such that $S_n \models P$). A spatial path interpolant for π is a sequence I_0, \ldots, I_n of Sep formulas such that

- for each $i \in [0, n]$, $S_i \models I_i$;
- for each $i \in [1, n]$, $\{I_{i-1}\}$ e_i^c $\{I_i\}$ is a valid triple in separation logic; and
- $-I_n \models P$.

Definition 2 (Spatial interpolant). Given Sep formulas S and I' and a command c such that $exec(c,S) \models I'$, a spatial interpolant (for S, c, and I') is a Sep formula I such that $S \models I$ and $\{I\}$ c $\{I'\}$ is valid.

Example Review



Definition 2 (Spatial interpolant). Given Sep formulas S and I' and a command c such that $exec(c, S) \models I'$, a spatial interpolant (for S, c, and I') is a Sep formula I such that $S \models I$ and $\{I\}$ c $\{I'\}$ is valid.

Phase 2: How to Compute Spatial Interpolants

Bounded Abduction:

Definition 3 (Bounded abduction). Let L, M, R be Sep formulas, and let X be a set of variables. A solution to the bounded abduction problem

$$L \vdash (\exists X. \ M * [\]) \vdash R$$

is a Sep formula A such that $L \models (\exists X.\ M*A) \models R$.

Bounded Abduction Rules

Allocate Suppose c is x := new(n, m). We take itp(S, c, I') = $(\exists x. A)$, where A is obtained as a solution to $\text{exec}(c, S) \vdash (\exists \vec{a}, \vec{z}. x \mapsto [\vec{a}, \vec{z}] * [A]) \vdash I'$, and \vec{a} and \vec{z} are vectors of fresh variables of length n and m, respectively.

Deallocate Suppose c is free(x). We take $itp(S, c, I') = (\exists \vec{a}, \vec{z}. \ I' * x \mapsto [\vec{a}, \vec{z}])$, where \vec{a} and \vec{z} are vectors of fresh variables whose lengths are determined by the unique heap cell which is allocated to x in S.

Assignment Suppose c is x := E. We take itp(S, c, I') = I'[E/x].

Bounded Abduction Rules for Load and Store

Store Suppose c is x->N_i := E. We take itp(S, c, I') = $(\exists \vec{a}, \vec{z}. \ A * x \mapsto [\vec{a}, \vec{z}])$, where A is obtained as a solution to $\text{exec}(c, S) \vdash (\exists \vec{a}, \vec{z}. \ x \mapsto [\vec{a}, \vec{z}[E/z_i]] * [A]) \vdash I'$ and where \vec{a} and \vec{z} are vectors of fresh variables whose lengths are determined by the unique heap cell which is allocated to x in S.

Load Suppose c is $y := x - N_i$. Suppose that \vec{a} and \vec{z} are vectors of fresh variables of lengths $|\vec{A}|$ and $|\vec{E}|$ where S is of the form $\Pi: \Sigma * w \mapsto [\vec{A}, \vec{E}]$ and $\Pi: \Sigma * w \mapsto [\vec{A}, \vec{E}] \vdash x = w$ (this is the condition under which $\text{exec}(\mathsf{c}, S)$ is defined, see Fig. 5). Let y' be a fresh variable, and define $\overline{S} = (y = z_i[y'/y]) * (\Pi: \Sigma * w \mapsto [\vec{a}, \vec{z}])[y'/y]$. Note that $\overline{S} \vdash (\exists y'. \overline{S}) \equiv \text{exec}(\mathsf{c}, S) \vdash I'$. We take $\text{itp}(S, \mathsf{c}, I') = (\exists \vec{a}, \vec{z}. A[z_i/y, y/y'] * x \mapsto [\vec{a}, \vec{z}])$ where A is obtained as a solution to $\overline{S} \vdash (\exists \vec{a}, \vec{z}. x[y'/y] \mapsto [\vec{a}, \vec{z}] * [A]) \vdash I'$.

Bounded Abduction Rules for Assume

Example:

$$itp(S, assume(x != null), (\exists a, z.x \mapsto [a, z] * true))$$

For c is assume(E != F)

to introduce recursive predicates for the assume interpolation rules. Let P,Q be Sep formulas such that $P \vdash Q$, let Z be a recursive predicate and \vec{E} be a vector of heap terms. We define $\operatorname{intro}(Z, \vec{E}, P, Q)$ as follows: if $P \vdash (\exists \emptyset. \ Z(\vec{E}) * [A]) \vdash Q$ has a solution and $A \nvdash Q$, define $\operatorname{intro}(Z, \vec{E}, P, Q) = Z(\vec{E}) * A$. Otherwise, define $\operatorname{intro}(Z, \vec{E}, P, Q) = Q$.

At last we take itp(S, c, I') to be M, where

$$M = \operatorname{intro}(Z_1, \vec{E}_1, S \wedge E \neq F, \operatorname{intro}(Z_2, \vec{E}_2, S \wedge E \neq F, \dots))$$

How is Bounded Abduction Conducted

Problem:

$$L \vdash \exists .M * [A] \vdash R$$

High level description:

- ullet Find a coloring of L, assign color red or blue to the heaplets in L. Red for satisfying M, blues are left overs.
- Compute the color strengthening [M'] * [A] for R by recursion on the proof of $L \vdash R$.
- Check $M * A \models R$, if failed the algorithm fails to compute the solution for the problem.

Phase 3: Spatial Interpolation Modulo Theories

```
Refined memory safety proof \zeta'
                                                                    Constraint system C
                                                                                                                                                      Solution \sigma
\{R_0(i) : true\}
                                                                    R_0(i') \leftarrow true
                                                                                                                                                      R_0(i): true
i = nondet(); x = null
                                                                    R_1(i') \leftarrow R_0(i)
                                                                                                                                                      R_1(i): true
\{R_1(i): \operatorname{ls}((\lambda a.R_{\operatorname{ls}1}(\nu,i)), x, \operatorname{null}) * \operatorname{true}\}\ R_2(i') \leftarrow R_1(i) \land i \neq 0 \land i' = i+1
                                                                                                                                                      R_2(i): true
assume(i != 0); \ldots; i--;
                                                                    R_3(i) \leftarrow R_2(i) \land i = 0
                                                                                                                                                      R_3(i): true
\{R_2(i) : \mathsf{ls}((\lambda a.R_{\mathsf{ls}2}(\nu,i)), x, \mathsf{null}) * \mathsf{true}\}\ R_4(i,d') \leftarrow R_3(i) \land R_{\mathsf{ls}3}(d',i)
                                                                                                                                                      R_4(i, d') : d' \ge 0
                                                                    R_{ls2}(\nu, i') \leftarrow R_1(i) \land R_{ls1}(\nu, i) \land i \neq 0 \land i' = i + 1 \quad R_{ls1}(\nu, i) : \nu \geqslant i
assume(i == 0)
\{R_3(i): \mathsf{ls}((\lambda a.R_{\mathsf{ls}3}(\nu,i)),x,\mathsf{null}) * \mathsf{true}\} \quad R_{\mathsf{ls}2}(\nu,i') \leftarrow R_1(i) \land \nu = i \land i \neq 0 \land i' = i+1
                                                                                                                                                      R_{ls2}(\nu, i) : \nu \geqslant i
                                                                    R_{ls3}(\nu, i) \leftarrow R_2(i) \wedge R_{ls2}(\nu, i) \wedge i = 0
                                                                                                                                                     R_{ls3}(\nu, i) : \nu \ge 0
assume(x != null)
\{(\exists d', y. R_4(i, d') : x \mapsto [d', y] * true)\}
                                                                   d' \ge 0 \leftarrow R_4(i, d')
```

Fig. 7. Example constraints.