# Shape analysis abstractions

MPRI — Cours 2.6 "Interprétation abstraite : application à la vérification et à l'analyse statique"

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# Shape analysis

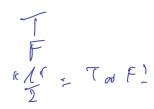
# Shape analyses aim at discovering structural invariants of programs that manipulate complex unbounded data-structures

#### **Applications**:

- establish memory safety
- verify the preservation of structural properties
   e.g., list, doubly-linked lists, trees, ...
- reason about programs that manipulate unbounded memory states

### Previous course: TVLA, i.e.,

- logical predicates which evaluate in three valued logic
- shape graphs, described by the predicates



# Another family of shape analyses

#### Today: systematically avoid weak updates

- a logic to describe properties of memory states
- abstract domain

suparation logic

- static analysis algorithms
- combination with numerical domains
- widening operators...

### Outline

- Introduction
- Separation Logic
- 3 A shape abstract domain relying on separation
- 4 Standard static analysis algorithms
- 5 Combining shape and value abstractions
- 6 Conclusion

# Separation logic principle: avoid weak updates

### How to deal with weak updates?

#### Avoid them!

- Always materialize exactly the cell that needs be modified
- Can be very costly to achieve, and not always feasible
- Notion of property that holds over a memory region:
   special separating conjunction operator \*
- Local reasoning:
   powerful principle, which allows to consider only part of the memory
- Separation logic has been used in many contexts, including manual verification, static analysis, etc...

# Separation logic

#### Two kinds of formulas:

- pure formulas behave like formulas in first-order logic i.e., are not attached to a memory region
- spatial formulas describe properties attached to a memory region

#### Pure formulas denote value properties



# Separation logic: points-to predicates

The next slides introduce the main separation logic formulas F ::= ...

We start with the most basic predicate, that describes a single cell:

### Points-to predicate

• Predicate:

$$F ::= ... \mid a \mapsto v$$
 where a is an address and v is a value

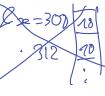
Concretization:

$$(e,h) \in \gamma(Y \mapsto v)$$
 if and only if  $h = [[V](e,h) \mapsto v]$ 

• Example:

$$F = \&x \mapsto 18$$
 
$$\&x = 308$$
 18

• We also note  $1 \mapsto e$ , as an I-value 1 denotes an address



# Separation logic: separating conjunction

 $\mu \times \mu$ 

**Merge of concrete heaps:** let  $h_0, h_1 \in (\mathbb{V}_{\mathrm{addr}} \to \mathbb{V})$ , such that  $\operatorname{dom}(h_0) \cap \operatorname{dom}(h_1) = \emptyset$ ; then, we let  $h_0 \circledast h_1$  be defined by:

$$h_0 \circledast h_1 : \operatorname{dom}(h_0) \cup \operatorname{dom}(h_1) \longrightarrow \mathbb{V}$$

$$x \in \operatorname{dom}(h_0) \longmapsto h_0(x)$$

$$x \in \operatorname{dom}(h_1) \longmapsto h_1(x)$$

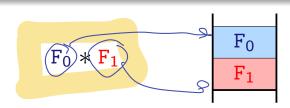
### Separating conjunction

• Predicate:

$$F ::= ... | F_0 * F_1 |$$

• Concretization:

$$\gamma(\mathtt{F}_0\ast\mathtt{F}_1)=\{(e,\mathit{h}_0\circledast\mathit{h}_1)\mid (e,\mathit{h}_0)\in\gamma(\mathtt{F}_0)\land(e,\mathit{h}_1)\in\gamma(\mathtt{F}_1)\}$$

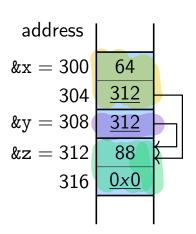


son ovarlapping

### An example

### Concrete memory layout

(pointer values underlined)



nha 
$$x (n+4) \mapsto b$$

$$e: x \mapsto 300$$

$$y \mapsto 308$$

$$z \mapsto 312$$

$$h: 300 \mapsto 64$$

$$304 \mapsto 312$$

 $308 \mapsto 312$ 

 $312 \mapsto 88$ 

 $316 \mapsto 0$ 

A formula that abstracts away the addresses:

$$\&x \mapsto \langle 64, \&z \rangle * \&y \mapsto \&z * \&z \mapsto \langle 88, 0 \rangle$$

# Separation logic: non separating conjunction

We can also add the **conventional conjunction operator**, with its **usual concretization**:

### Non separating conjunction

• Predicate:

$$F ::= \ldots \mid F_0 \wedge F_1$$

Concretization:

$$\gamma(\mathtt{F_0} \wedge \mathtt{F_1}) = \gamma(\mathtt{F_0}) \cap \gamma(\mathtt{F_1})$$

Exercise: describe and compare the concretizations of

$$\bullet \, [\&\mathtt{a} \mapsto \&\mathtt{b} \land [\&\mathtt{b} \mapsto \&\mathtt{a}]$$

ullet &a  $\mapsto$  &b \* &b  $\mapsto$  &a





# Separating conjunction vs non separating conjunction

- Classical conjunction: properties for the same memory region
- Separating conjunction: properties for disjoint memory regions

$$\&a \mapsto \&b \land \&b \mapsto \&a$$

- the same heap verifies &a  $\mapsto$  &b and &b  $\mapsto$  &a
- there can be only one cell
- thus a = b

$$\&a \mapsto \&b * \&b \mapsto \&a$$

- two separate sub-heaps respectively satisfy &a → &b and &b → &a
- thus  $a \neq b$
- Separating conjunction and non-separating conjunction have very different properties
- Both express very different properties e.g., no ambiguity on weak / strong updates

# Separating and non separating conjunction

#### Logic rules of the two conjunction operators of SL:

Separating conjunction:

$$\frac{(e, h_0) \in \gamma(F_0) \qquad (e, h_1) \in \gamma(F_1)}{(e, h_0 \circledast h_1) \in \gamma(F_0 * F_1)}$$

linearity resource awar

Non separating conjunction:

$$\frac{(e, h) \in \gamma(F_0) \quad (e, h) \in \gamma(F_1)}{(e, h) \in \gamma(F_0 \land F_1)}$$

classical

Reminiscent of Linear Logic [Girard87]: resource aware / non resource aware conjunction operators

# Separation logic: empty store

### **Empty store**

• Predicate:

Concretization:

$$\gamma(\mathsf{emp}) = \{(e, []) \mid e \in \mathbb{E}\} = \mathbb{E} \times \{[]\}$$

where [] denotes the empty store

- emp is the neutral element for \*
   (monoid structure induced by \*)
- by contrast the **neutral element for**  $\wedge$  is TRUE, with concretization:

$$\gamma(\mathtt{TRUE}) = \mathbb{E} imes \mathbb{H}$$

### Separation logic: other connectors

#### **Disjunction:**

- $F ::= ... | F_0 \vee F_1 |$
- concretization:

$$\gamma(\mathtt{F_0} \vee \mathtt{F_1}) = \gamma(\mathtt{F_0}) \cup \gamma(\mathtt{F_1})$$

### Spatial implication (aka, magic wand):

- $F ::= ... | F_0 * F_1 |$
- concretization:

 very powerful connector to describe structure segments, used in complex SL proofs

# Separation logic

Summary of the main separation logic constructions seen so far:

### Separation logic main connectors

Concretization of pure formulas is standard

#### How does this help for program reasoning?

# Separation logic triple

### Program proofs based on Hoare triples

• Notation:  $\{F\}p\{F'\}$  if and only if:

$$orall s, s' \in \mathbb{S}, \; s \in \gamma(\mathtt{F}) \wedge s' \in \llbracket p 
rbracket(s) \Longrightarrow s' \in \gamma(\mathtt{F}')$$

Application: formalize proofs of programs

A few rules (straightforward proofs):

$$\begin{split} & \overline{\{\&\mathtt{x}\mapsto?\}\mathtt{x} := \mathsf{e}\{\&\mathtt{x}\mapsto\mathsf{e}\}} \ \ \text{mutation} \\ & \underline{F_0\Longrightarrow F_0'} \quad \{F_0'\}\mathsf{b}\{F_1'\} \quad F_1'\Longrightarrow F_1 \\ & \overline{\{F_0\}\mathsf{b}\{F_1\}} \\ & \underline{\mathtt{x} \ \mathsf{does} \ \mathsf{not} \ \mathsf{appear} \ \mathsf{in} \ F} \\ & \underline{\{\&\mathtt{x}\mapsto?*F\}\mathtt{x} := \mathsf{e}\{\&\mathtt{x}\mapsto\mathsf{e}*F\}} \ \ \mathsf{mutation-2} \end{split}$$

(we assume that e does not allocate memory)

### The frame rule

What about the resemblance between rules "mutation" and "mutation-2"?

# Theorem: the frame rule

 $\frac{\{F_0\}b\{F_1\}\quad \mathsf{freevar}(F)\cap \mathsf{write}(b)=\emptyset}{\{F_0*F\}b\{F_1*F\}} \text{ frame}$ 

- Proof by induction on the logical rules on program statements, i.e., essentially a large case analysis (see biblio for a more complete set of rules)
- Rules are proved by case analysis on the program syntax

#### The frame rule allows to reason locally about programs



# Application of the frame rule

A program with intermittent invariants, derived using the frame rule, since each step impacts a disjoint region:

```
int i;
int * x;
int * y;
{&i →? * &x →? * &y →?}
    x = &i;
{&i →? * &x → &i * &y →?}
    y = &i;
{&i →? * &x → &i * &y → &i}
    x = 42;
{&i → 42 * &x → &i * &y → &i}
```

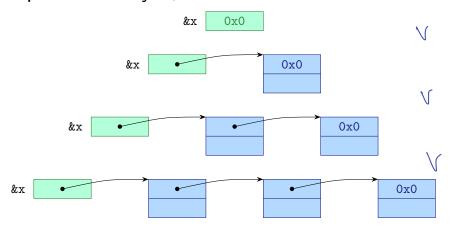
Many other program proofs done using separation logic e.g., verification of the Deutsch-Shorr-Waite algorithm (biblio)

### Summarization and inductive definitions

#### What do we still miss?

So far, formulas denote **fixed sets of cells**Thus, no summarization of unbounded regions...

• Example all lists pointed to by x, such as:



 How to precisely abstract these stores with a single formula i.e., no infinite disjunction ?

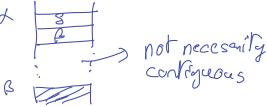
# Inductive definitions in separation logic

# X =00

### List definition

• Formula abstracting our set of structures:

&x 
$$\mapsto \alpha * \alpha \cdot \mathsf{list}$$



- Concretization: next slide...

### Practical implementation in verification/analysis tools

- Verification: hand-written definitions
- Analysis: either built-in or user-supplied, or partly inferred

# Concretization by unfolding

### Intuitive semantics of inductive predicates

- Inductive predicates can be **unfolded**, by **unrolling their definitions**Syntactic unfolding is noted  $\stackrel{\mathcal{U}}{\longrightarrow}$
- A formula F with inductive predicates describes all stores described by all formulas F' such that  $F \xrightarrow{\mathcal{U}} F'$

#### Example:

• Let us start with  $x \mapsto \alpha_0 * \alpha_0 \cdot \text{list}$ ; we can unfold it as follows:

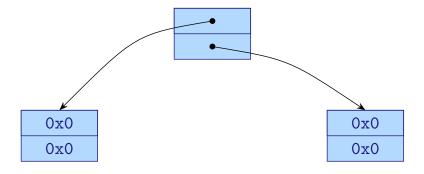
$$\begin{array}{ll} \&\mathtt{x} \mapsto \alpha_0 * \alpha_0 \cdot \mathsf{list} \\ \xrightarrow{\mathcal{U}} & \&\mathtt{x} \mapsto \alpha_0 * \alpha_0 \cdot \mathsf{next} \mapsto \alpha_1 * \alpha_0 \cdot \mathsf{data} \mapsto \beta_1 * \alpha_1 \cdot \mathsf{list} \\ \xrightarrow{\mathcal{U}} & \&\mathtt{x} \mapsto \alpha_0 * \alpha_0 \cdot \mathsf{next} \mapsto \alpha_1 * \alpha_0 \cdot \mathsf{data} \mapsto \beta_1 * \mathsf{emp} \wedge \alpha_1 = \mathbf{0x0} \end{array}$$

• We get the concrete state below:



### Example: tree

#### • Example:



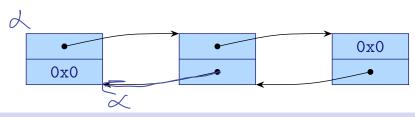
### Inductive definition

• Two recursive calls instead of one:

$$\begin{array}{rcl} \alpha \cdot \mathsf{tree} &:= & \alpha = \mathsf{0} \, \wedge \, \mathsf{emp} \\ & \vee & \alpha \neq \mathsf{0} \, \wedge \, \alpha \cdot \mathsf{left} \mapsto \beta * \alpha \cdot \mathsf{right} \mapsto \delta \\ & * \beta \cdot \mathsf{tree} * \delta \cdot \mathsf{tree} \end{array}$$

# Example: doubly linked list

Example:



#### Inductive definition

• We need to propagate the prev pointer as an additional parameter:

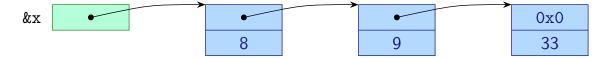
$$\alpha \cdot \mathsf{dll}(\delta) := \alpha = 0 \land \mathsf{emp}$$

$$\forall \quad \alpha \neq 0 \land \alpha \cdot \mathsf{next} \mapsto \beta * \alpha \cdot \mathsf{prev} \mapsto \delta$$

$$* \beta \cdot \mathsf{dll}(\alpha)$$

### Example: sortedness

• Example: sorted list



#### Inductive definition

- Each element should be greater than the previous one
- The first element simply needs be greater than  $-\infty...$
- We need to propagate the lower bound, using a scalar parameter

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### Design of an abstract domain

#### A lot of things are missing to turn SL into an abstract domain

#### Set of logical predicates:

- separation logic formulas are very expressive
   e.g., arbitrary alternations of ∧ and \*
- such expressiveness is not necessarily required in static analysis

#### Representation:

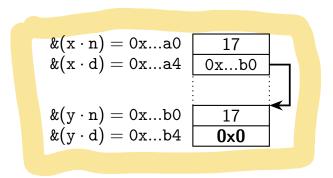
- unstructured formulas can be represented as ASTs,
   but this representation is not easy to manipulate efficiently
- intuition over memory states typically involves graphs

#### **Analysis algorithms:**

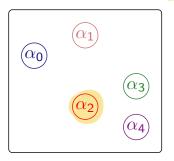
 inference of "optimal" invariants in SL, with numerical predicates obviously not computable

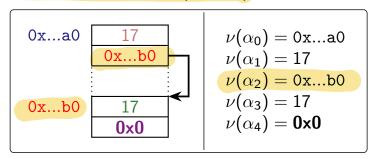
#### Concrete memory states

- very low level description numeric offsets / field names
- pointers, numeric values: raw sequences of bits



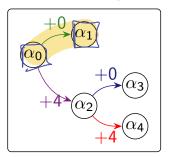
- Concrete memory states
- Abstraction of values into symbolic variables (nodes)

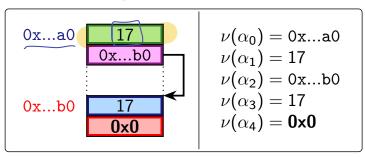




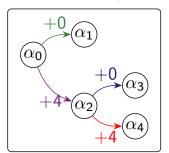
- characterized by valuation  $\nu$
- $\triangleright$   $\nu$  maps symbolic variables into concrete addresses

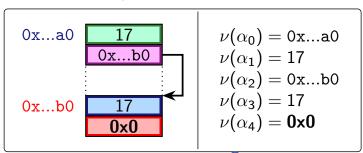
- Concrete memory states
- Abstraction of values into symbolic variables / nodes
- Abstraction of regions into points-to edges





- Concrete memory states
- Abstraction of values into symbolic variables / nodes
- Abstraction of regions into points-to edges





Shape graph concretization

$$\gamma_{\mathsf{sh}}(\mathsf{G}) = \{(\underline{\mathtt{h}}, 
u) \mid \ldots \}$$

valuation  $\nu$  plays an important role to combine abstraction...

# Structure of shape graphs

#### Valuations bridge the gap between nodes and values

Symbolic variables / nodes and intuitively abstract concrete values:

### Symbolic variables

We let  $\mathbb{V}^{\sharp}$  denote a countable set of **symbolic variables**; we usually let them be denoted by Greek letters in the following:  $\mathbb{V}^{\sharp} = \{\alpha, \beta, \delta, \ldots\}$ 

When concretizing a shape graph, we need to characterize how the concrete instance evaluates each symbolic variable, which is the purpose of the valuation functions:

#### **Valuations**

A valuation is a function from symbolic variables into concrete values (and is often denoted by  $\nu$ ): Val =  $\mathbb{V}^{\sharp} \longrightarrow \mathbb{V}$ 

Note that valuations treat in the same way addresses and raw values

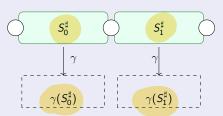
# Structure of shape graphs

#### Distinct edges describe separate regions

In particular, if we **split** a graph into **two parts**:

### Separating conjunction

$$\gamma_{\mathsf{sh}}(S_0^{\sharp} * S_1^{\sharp}) = \{ (h_0 \circledast h_1, \nu) \mid (h_0, \nu) \in \gamma_{\mathsf{sh}}(S_0^{\sharp}) \land (h_1, \nu) \in \gamma_{\mathsf{sh}}(S_1^{\sharp}) \}$$



Similarly, when considering the **empty set of edges**, we get the empty heap (where  $V^{\sharp}$  is the set of nodes):

$$\gamma_{\mathsf{sh}}(\mathsf{emp}) = \{ (\emptyset, \nu) \mid \nu : \mathbb{V}^{\sharp} \to \mathbb{V} \}$$

# Abstraction of contiguous regions

### A single points-to edge represents one heap cell

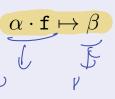
A points-to edge encodes basic points to predicate in separation logic:

### Points-to edges

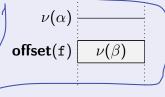
Syntax

Graph edge | Separation logic formula









Concretization:

$$\gamma_{\mathsf{sh}}(\alpha \cdot \mathtt{f} \mapsto \beta) = \{([\nu(\alpha) + \mathsf{offset}(\mathtt{f}) \mapsto \nu(\beta)], \nu) \mid \nu : \{\alpha, \beta, \ldots\} \to \mathbb{N}\}$$

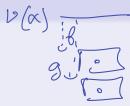
# Abstraction of contiguous regions

#### Contiguous regions are described by adjacent points-to edges

To describe **blocks** containing series of **cells** (*e.g.*, in a **C structure**), shape graphs utilize several outgoing edges from the node representing the base address of the block

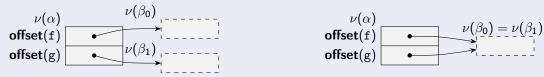
### Field splitting model

Separation impacts edges / fields, not pointers



Shape graph

accounts for both abstract states below:

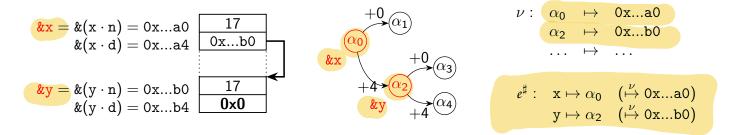


In other words, in a field splitting model, separation:

- asserts addresses are distinct
- says nothing about contents

### Abstraction of the environment

### Environments bind variables to their (concrete / abstract) address



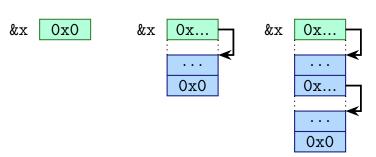
### Abstract environments

- An abstract environment is a function  $e^{\sharp}$  from variables to symbolic nodes
- The concretization extends as follows:

$$\gamma_{\mathsf{mem}}(e^{\sharp},S^{\sharp}) = \{(e,h,
u) \mid (h,
u) \in \gamma_{\mathsf{sh}}(S^{\sharp}) \land e = 
u \circ e^{\sharp}\}$$

### Basic abstraction: summarization

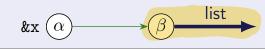
#### Set of all lists of any length:



# Well-founded list inductive def.

$$\begin{array}{l} \alpha \cdot \mathsf{list} := \\ (\mathsf{emp} \land \alpha = \mathbf{0x0}) \\ \lor \quad (\alpha \cdot \mathsf{d} \mapsto \beta_0 * \alpha \cdot \mathsf{n} \mapsto \beta_1 \\ \quad * \beta_1 \cdot \mathsf{list} \land \alpha \neq \mathbf{0x0}) \\ \mathsf{well-founded\ predicate} \end{array}$$





B-list

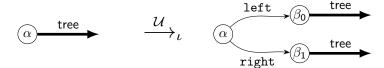
### Concretization based on unfolding and least-fixpoint:

- $\xrightarrow{\mathcal{U}}$  replaces an  $\alpha$  · list predicate with one of its premises

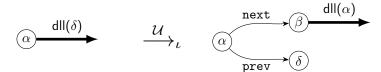
### Inductive structures: a few instances

As before, **many interesting inductive predicates** encode nicely into graph inductive definitions:

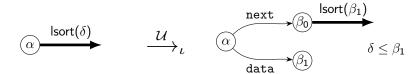
More complex shapes: trees



Relations among pointers: doubly-linked lists

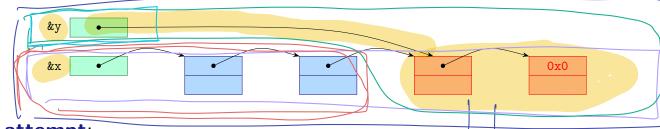


• Relations between pointers and numerical: sorted lists



## Inductive segments

#### A frequent pattern:



### A first attempt:

- x points to a list, so &x  $\mapsto \alpha * \alpha \cdot \text{list}$  holds  $\leftarrow$
- y points to a list, so &y  $\mapsto \beta * \beta \cdot \text{list}$  holds  $\subset$

However, the following does not hold

$$\&x \mapsto \alpha * \alpha \cdot \text{list} * \&y \mapsto \beta * \beta \cdot \text{list}$$

Why? violation of separation!

### A second attempt:

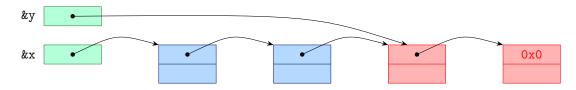
$$(\&x \mapsto \alpha * \alpha \cdot \mathsf{list} * \mathsf{TRUE}) \land (\&y \mapsto \beta * \beta \cdot \mathsf{list} * \mathsf{TRUE})$$

Why is it still not all that good ? relation lost!

 $dom(-) \cap dom(-) = \emptyset$ 

## Inductive segments

#### A frequent pattern:

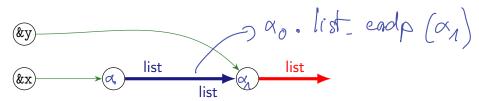


Could be **expressed directly** as an inductive with a parameter:

$$lpha \cdot \mathsf{list\_endp}(\pi) ::= \underbrace{(\mathsf{emp}, lpha = \pi)}_{ (lpha \cdot \mathsf{next} \mapsto eta_0 * lpha \cdot \mathsf{data} \mapsto eta_1 }_{* eta_0 \cdot \mathsf{list}} = \mathsf{endp}(\pi), lpha \neq 0)$$

This definition straightforwardly derives from list

Thus, we make segments part of the fundamental predicates of the domain



Multi-segments: possible, but harder for analysis

## Shape graphs and separation logic

**Semantic preserving translation** □ of graphs into separation logic formulas:

Graph $S^\sharp \in \mathbb{D}^\sharp_sh$	Translated formula $\Pi(S^{\sharp})$
$ \begin{array}{c} \alpha \\ \hline \mathbf{f} \end{array} $	$\alpha \cdot \mathtt{f} \mapsto \beta$
$S_0^{\sharp}$ $S_1^{\sharp}$	$\Pi(S_0^\sharp) * \Pi(S_1^\sharp)$
(a) list	$lpha \cdot list$
$\begin{array}{c c} \alpha & \text{list} \\ \hline \\ \delta & \\ \end{array}$	$lpha \cdot list\_endp(\delta)$
other inductives and segments	similar

#### Note that:



- shape graphs can be encoded into separation logic formula
- the opposite is usually not true

#### Value information:

- discussed in the next course
- intuitively, assume we maintain numerical information next to shape graphs

### Outline

- Introduction
- 2 Separation Logic
- 3 A shape abstract domain relying on separation
- Standard static analysis algorithms
  - Overview of the analysis
  - Post-conditions and unfolding
  - Folding: widening and inclusion checking
  - Abstract interpretation framework: assumptions and results
  - Comparing Separation Logic and Three-Valued logic abstractions
- 5 Combining shape and value abstractions
- 6 Conclusion

## Static analysis overview

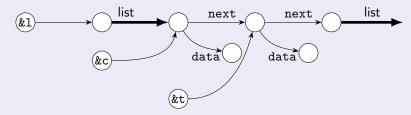
#### A list insertion function:

- list inductive structure def.
- Abstract precondition: list \*1 assumed to point to a list



### Result of the (interprocedural) analysis

• Over-approximations of reachable concrete states e.g., after the insertion:



### Transfer functions

### Abstract interpreter design

- Follows the semantics of the language under consideration
- The abstract domain should provide sound transfer functions

#### **Transfer functions:**

- Assignment:  $x \to f = y \to g$  or  $x \to f = e_{arith}$
- Test: analysis of conditions (if, while)
- Variable creation and removal
- Memory management: malloc, free

#### **Abstract operators:**

- Join and widening: over-approximation
- Inclusion checking: check stabilization of abstract iterates

Should be sound i.e., not forget any concrete behavior

## Abstract operations

### Denotational style abstract interpreter

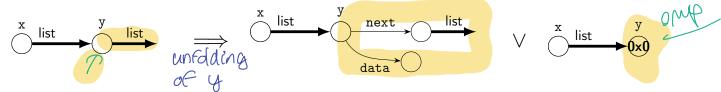
- Concrete denotational semantics [b]: S → P(S)
- Abstract post-condition [b]<sup>‡</sup>(S), computed by the analysis:

$$s \in \gamma(\mathsf{S}) \Longrightarrow \llbracket \mathsf{b} \rrbracket(s) \subseteq \gamma(\llbracket \mathsf{b} \rrbracket^\sharp(\mathsf{S}))$$

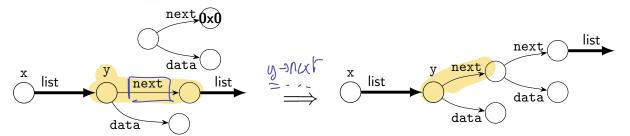
#### Analysis by induction on the syntax using domain operators

## The algorithms underlying the transfer functions

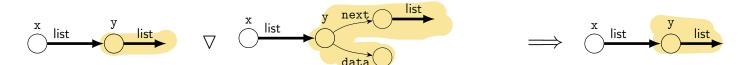
Unfolding: cases analysis on summaries



• Abstract postconditions, on "exact" regions, e.g. insertion



• Widening: builds summaries and ensures termination



### Outline

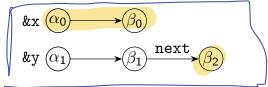
- Introduction
- 2 Separation Logic
- 3 A shape abstract domain relying on separation
- Standard static analysis algorithms
  - Overview of the analysis
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  - Comparing Separation Logic and Three-Valued logic abstractions
- 5 Combining shape and value abstractions
- 6 Conclusion

## Analysis of an assignment in the graph domain

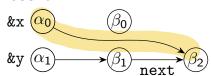
Steps for analyzing x = y -> next (local reasoning)

- Evaluate I-value x into points-to edge  $\alpha \mapsto \beta$
- 2 Evaluate **r-value** y -> next into **node**  $\beta'$
- 3 Replace points-to edge  $\alpha \mapsto \beta$  with **points-to edge**  $\alpha \mapsto \beta'$

#### With pre-condition:



- Step 1 produces  $\alpha_0 \mapsto \beta_0$
- Step 2 produces  $\beta_2$
- End result:



#### With pre-condition:

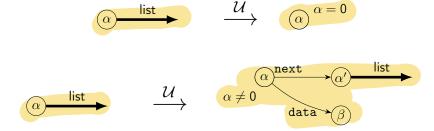
&x 
$$\alpha_0$$
  $\beta_0$  list

- Step 1 produces  $\alpha_0 \mapsto \beta_0$
- Step 2 fails
- Abstract state too abstract
- We need to refine it

## Unfolding as a local case analysis

### Unfolding principle

- Case analysis, based on the inductive definition
- Generates symbolic disjunctions (analysis performed in a disjunction) **domain**, *e.g.*, trace partitioning)
- Example, for lists:



• Numeric predicates: next course on shape + value abstraction

Soundness: by definition of the concretization of inductive structures

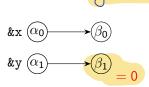
$$\gamma_{\mathsf{sh}}(S^\sharp) \subseteq \bigcup \{\gamma_{\mathsf{sh}}(S_0^\sharp) \mid S^\sharp \stackrel{\mathcal{U}}{\longrightarrow} S_0^\sharp \}$$

## Analysis of an assignment, with unfolding

### Principle

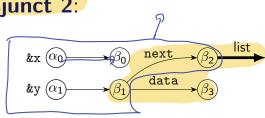
- We have  $\gamma_{\sf sh}(\alpha \cdot \iota) = \bigcup \{\gamma_{\sf sh}(S^{\sharp}) \mid \alpha \cdot \iota \xrightarrow{\mathcal{U}} S^{\sharp}\}$
- ullet Replace  $lpha \cdot \iota$  with a finite number of disjuncts and continue

## Disjunct 1: 254 -> next



- Step 1 produces  $\alpha_0 \mapsto \beta_0$
- Step 2 fails: Null pointer!
- In a **correct** program, would be ruled out by a **condition**  $y \neq 0$  i.e.,  $\beta_1 \neq 0$  in  $\mathbb{D}_{\text{num}}^{\sharp}$

### Disjunct 2:



- Step 1 produces  $\alpha_0 \mapsto \beta_0$
- Step 2 produces  $\beta_2$
- End result:

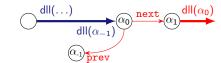


## Unfolding and degenerated cases

assume(1 points to a dl1) c = 1;① while( $c \neq NULL \&\& condition$ ) c = c -> next;② if( $c \neq 0 \&\& c -> prev \neq 0$ )  $c = c -> prev \rightarrow prev;$ 

- at 2:  $\bigcirc_1^{\text{do}} \stackrel{\text{dll}(\delta_0)}{\underset{\text{c}}{\text{dll}(\delta_1)}} \bigcirc_{\text{c}}^{\text{dll}(\delta_1)}$
- ⇒ non trivial unfolding

• Materialization of c -> prev:



## Segment splitting lemma: basis for segment unfolding

- Materialization of c -> prev -> prev:
- $\frac{\text{dll}(\ldots)}{\text{dll}(\alpha_{-2})} \underbrace{\text{next}}_{\text{prev}} \underbrace{\alpha_0} \underbrace{\text{next}}_{\text{old}} \underbrace{\alpha_1}$
- Implementation issue: discover which inductive edge to unfold very hard!

### Outline

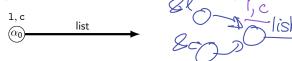
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## Need for a folding operation

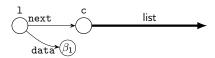
#### Back to the **list traversal** example:

### First iterates in the loop:

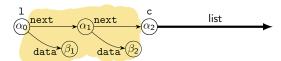
• at iteration 0 (before entering the loop):



at iteration 1:

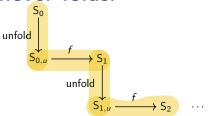


• at iteration 2:



```
\begin{aligned} & \textbf{assume}(\texttt{l} \ \ points \ \ to \ \ a \ \ list) \\ & c = \texttt{l}; \\ & \textbf{while}(\texttt{c} \neq \texttt{NULL})\{ \\ & c = \texttt{c} \rightarrow \texttt{next}; \\ & \} \end{aligned}
```

The analysis **unfolds**, but **never folds**:



- How to guarantee termination of the analysis?
- How to introduce segment edges / perform abstraction ?

- The lattice of shape abstract values has infinite height
- Thus iteration sequences may not terminate

### 

Over-approximates join:

$$\left\{ \begin{array}{l} \gamma(X^{\sharp}) & \subseteq & \gamma(X^{\sharp} \triangledown Y^{\sharp}) \\ \gamma(Y^{\sharp}) & \subseteq & \gamma(X^{\sharp} \triangledown Y^{\sharp}) \end{array} \right.$$

• Enforces termination: for all sequence  $(X_n^{\sharp})_{n\in\mathbb{N}}$ , the sequence  $(Y_n^{\sharp})_{n\in\mathbb{N}}$  defined below is ultimately stationary

$$\begin{cases}
Y_0^{\sharp} = X_0^{\sharp} \\
\forall n \in \mathbb{N}, Y_{n+1}^{\sharp} = Y_n^{\sharp} \nabla X_{n+1}^{\sharp}
\end{cases}$$

### Canonicalization

### Upper closure operator

 $\rho: \mathbb{D}^{\sharp} \longrightarrow \mathbb{D}_{can}^{\sharp} \subseteq \mathbb{D}^{\sharp}$  is an **upper closure operator** (uco) iff it is monotone, extensive and idempotent.

#### Canonicalization

- Disjunctive completion:  $\mathbb{D}^{\sharp}_{\vee}$  = finite disjunctions over  $\mathbb{D}^{\sharp}$
- Canonicalization operator  $\rho_{\vee}$  defined by  $\rho_{\vee}: \mathbb{D}^{\sharp}_{\vee} \longrightarrow \mathbb{D}^{\sharp}_{can_{\vee}}$  and  $\rho_{\vee}(X^{\sharp}) = \{\rho(x^{\sharp}) \mid x^{\sharp} \in X^{\sharp}\}$  where  $\rho$  is an uco and  $\mathbb{D}_{can}^{\sharp}$  is finite
- Canonicalization is used in many shape analysis tools
- Easier to compute but less powerful than widening: does not exploit history of computation

## Weakening: definition

To design **inclusion test**, **join** and **widening** algorithms, we first study a more general notion of **weakening**:

### Weakening

We say that  $S_0^{\sharp}$  can be weakened into  $S_1^{\sharp}$  if and only if

$$\forall (h, \nu) \in \gamma_{\mathsf{sh}}(S_0^\sharp), \; \exists \nu' \in \mathsf{Val}, \; (h, \nu') \in \gamma_{\mathsf{sh}}(S_1^\sharp)$$

We then note  $S_0^{\sharp} \leqslant S_1^{\sharp}$ 

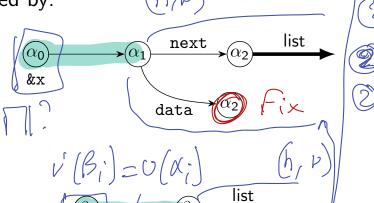
#### **Applications:**

- inclusion test (comparison) inputs  $S_0^{\sharp}, S_1^{\sharp}$ ; if returns true  $S_0^{\sharp} \prec S_1^{\sharp}$
- canonicalization (unary weakening) inputs  $S_0^{\sharp}$  and returns  $\rho(S_0^{\sharp})$  such that  $S_0^{\sharp} \preccurlyeq \rho(S_0^{\sharp})$
- widening / join (binary weakening ensuring termination or not) inputs  $S_0^{\sharp}, S_1^{\sharp}$  and returns  $S_{\mathrm{up}}^{\sharp}$  such that  $S_i^{\sharp} \preccurlyeq S_{\mathrm{up}}^{\sharp}$

## Weakening: example

We consider  $S_0^{\sharp}$  defined by:

and  $S_1^{\sharp}$  defined by:



&x

Then, we have the weakening  $S_0^{\sharp} \prec S_1^{\sharp}$  up-to a renaming in  $S_1^{\sharp}$ .

- weakening up-to renaming is generally required as graphs do not have the same name space
- formalized a bit later...

42:B-1-

B +0 B, ->
+4 > B, -> D By Dix B2 Ho X2

## Local weakening: separating conjunction rule

### We can apply the local reasoning principle to weakening

If  $S_0^{\sharp} \preceq S_{0,\text{weak}}^{\sharp}$  and  $S_1^{\sharp} \preceq S_{1,\text{weak}}^{\sharp}$  then:

$$\alpha_0$$
  $S_0^{\sharp}$   $\alpha_1$   $S_1^{\sharp}$   $\alpha_2$   $\prec$   $\alpha_0$   $S_{0,\text{weak}}^{\sharp}$   $\alpha_1$   $S_{1,\text{weak}}^{\sharp}$   $\alpha_2$ 

## 

Let us assume that

- $S_0^{\sharp}$  and  $S_1^{\sharp}$  have distinct set of source nodes
- we can weaken  $S_0^{\sharp}$  into  $S_{0,\text{weak}}^{\sharp}$
- we can weaken  $S_1^{\sharp}$  into  $S_{1,\text{weak}}^{\sharp}$

then:

we can weaken 
$$S_0^{\sharp} * S_1^{\sharp}$$
 into  $S_{0,\text{weak}}^{\sharp} * S_{1,\text{weak}}^{\sharp}$ 

## Local weakening: unfolding rule, identity rule

## Weakening unfolded region $(\preceq_{\mathcal{U}})$

Let us assume that  $S_0^{\sharp} \xrightarrow{\mathcal{U}} S_1^{\sharp}$ . Then, by definition of the concretization of unfolding

we can weaken 
$$S_1^{\sharp}$$
 into  $S_0^{\sharp}$ 

- the proof follows from the definition of unfolding
- it can be applied locally, on graph regions that differ due to unfolding of inductive definitions

## Identity weakening (≼<sub>Id</sub>)

we can weaken  $S^{\sharp}$  into  $S^{\sharp}$ 

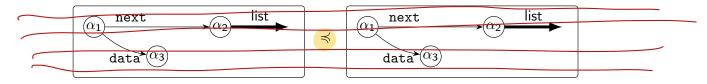
• the proof is trivial:

$$\gamma_{\sf sh}(S^{\sharp}) \subseteq \gamma_{\sf sh}(S^{\sharp})$$

• on itself, this principle is not very useful, but it can be applied locally, and combined with  $(\leq_{\mathcal{U}})$  on graph regions that are not equal

## Local weakening: example

### By rule (≺<sub>Id</sub>):



### Thus, by **rule** $(\preceq_{\mathcal{U}})$ :



#### Additionally, by **rule** ( $\leq_{Id}$ ):



### Thus, by **rule** $(\preccurlyeq_*)$ :



## Inclusion checking rules in the shape domain

Graphs to compare have distinct sets of nodes, thus inclusion check should carry out a valuation transformer  $\Psi: \mathbb{V}^{\sharp}(S_{1}^{\sharp}) \longrightarrow \mathbb{V}^{\sharp}(S_{0}^{\sharp})$  (important when dealing also with content values)

Using (and extending) the weakening principles, we obtain the following rules (considering only inductive definition list, though these rules would extend to other definitions straightforwardly): • Identity rules: > weakening identity

$$\forall i, \widehat{\Psi}(\beta_i) = \alpha_i \implies \widehat{\alpha_0 \cdot \mathbf{f} \mapsto \alpha_1} \sqsubseteq^{\sharp}_{\Psi} \widehat{\beta_0 \cdot \mathbf{f} \mapsto \beta_1}$$

$$\Psi(\beta) = \alpha \implies \widehat{\alpha \cdot \text{list}} \sqsubseteq^{\sharp}_{\Psi} \widehat{\beta \cdot \text{list}}$$

$$\forall i, \ \Psi(\beta_i) = \alpha_i \implies \alpha_0 \cdot \text{list\_endp}(\alpha_1) \sqsubseteq^{\sharp}_{\Psi} \widehat{\beta_0 \cdot \text{list\_endp}(\beta_1)}$$

• Rules on inductives:

$$\forall i, \ \Psi(\beta_i) = \alpha \implies \mathsf{emp} \ \sqsubseteq^{\sharp}_{\Psi} \ \beta_0 \cdot \mathsf{list\_endp}(\beta_1)$$

$$S_0^{\sharp} \sqsubseteq^{\sharp}_{\Psi} S_1^{\sharp} \wedge \beta \cdot \iota \xrightarrow{\mathcal{U}} S_1^{\sharp} \implies S_0^{\sharp} \sqsubseteq^{\sharp}_{\Psi} \ \beta \cdot \iota$$
if  $\beta_1$  fresh  $, \Psi' = \Psi[\beta_1 \mapsto \alpha_1]$  and  $\Psi(\beta_0) = \alpha_0$  then,
$$S_0^{\sharp} \sqsubseteq^{\sharp}_{\Psi'} \beta_1 \cdot \mathsf{list} \implies \alpha_0 \cdot \mathsf{list\_endp}(\alpha_1) * S_0^{\sharp} \sqsubseteq^{\sharp}_{\Psi} \ \beta_0 \cdot \iota$$

## Inclusion checking algorithm

## Comparison of $(e_0^{\sharp}, S_0^{\sharp})$ and $(e_1^{\sharp}, S_1^{\sharp})$

- start with  $\Psi$  defined by  $\Psi(\beta) = \alpha$  if and only if there exists a variable x such that  $e_0^{\sharp}(\mathbf{x}) = \alpha \wedge e_1^{\sharp}(\mathbf{x}) = \beta$
- 2 [iteratively apply local rules, and extend  $\Psi$  when needed
- 3 return true when both shape graphs become empty
  - the first step ensures both environments are consistent

This algorithm is sound:

### Soundness

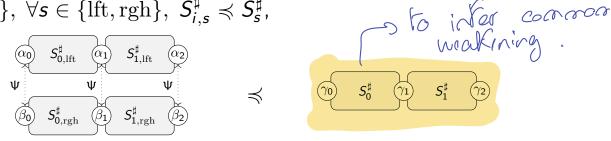
$$(e_0^\sharp,S_0^\sharp) \sqsubseteq^\sharp (e_1^\sharp,S_1^\sharp) \Longrightarrow \gamma(e_0^\sharp,S_0^\sharp) \subseteq \gamma(e_1^\sharp,S_1^\sharp)$$



## Over-approximation of union

The principle of join and widening algorithm is similar to that of  $\sqsubseteq^{\sharp}$ :

• It can be computed **region by region**, as for weakening in general: If  $\forall i \in \{0,1\}, \ \forall s \in \{\text{lft}, \text{rgh}\}, \ S_{i,s}^{\sharp} \preccurlyeq S_{s}^{\sharp}$ ,



The partitioning of inputs / different nodes sets requires a **node correspondence function** 

$$\Psi: \mathbb{V}^\sharp(S^\sharp_{\mathrm{lft}}) imes \mathbb{V}^\sharp(S^\sharp_{\mathrm{rgh}}) \longrightarrow \mathbb{V}^\sharp(S^\sharp)$$

 The computation of the shape join progresses by the application of local join rules, that produce a new (output) shape graph, that weakens both inputs

## Over-approximation of union: syntactic identity rules

In the next few slides, we focus on  $\nabla$  though the abstract union would be defined similarly in the shape domain

Several rules derive **from** ( $\leq_{ld}$ ):

• If  $S_{\text{lft}}^{\sharp} = \alpha_0 \cdot \mathbf{f} \mapsto \alpha_1$ and  $S_{\text{lft}}^{\sharp} = \beta_0 \cdot \mathbf{f} \mapsto \beta_1$ 

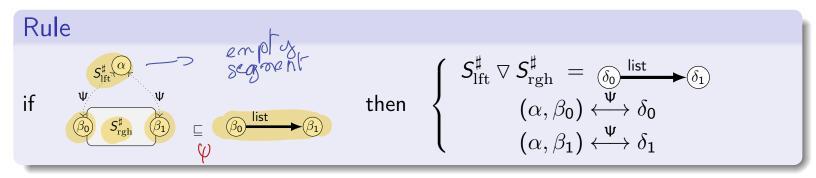
and  $\Psi(\alpha_0, \beta_0) = \delta_0$ ,  $\Psi(\alpha_1, \beta_1) = \delta_1$ , then:

$$S^{\sharp}_{ ext{lft}} lashed S^{\sharp}_{ ext{rgh}} = \delta_{0} \cdot \mathtt{f} \mapsto \delta_{1}$$

• If  $S_{\mathrm{lft}}^{\sharp} = \alpha_0 \cdot \mathsf{list}$ and  $S_{\mathrm{lft}}^{\sharp} = \beta_0 \cdot \mathsf{list}_1$ and  $\Psi(\alpha_0, \beta_0) = \delta_0$ , then:

$$S_{\mathrm{lft}}^{\sharp} \triangledown S_{\mathrm{rgh}}^{\sharp} = \delta_{0} \cdot \mathsf{list}$$

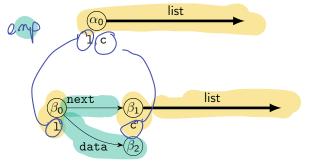
## Over-approximation of union: segment introduction rule



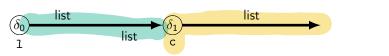
#### **Application to list traversal**, at the end of iteration 1:

• before iteration 0:

• end of iteration 0:



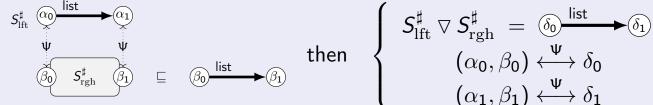
• join, before iteration 1:



$$\begin{cases}
\Psi(\alpha_0, \beta_0) = \delta_0 \\
\Psi(\alpha_0, \beta_1) = \delta_1
\end{cases}$$

## Over-approximation of union: segment extension rule

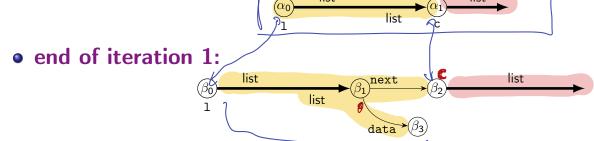
### Rule



$$\begin{cases} S_{\mathrm{lft}}^{\sharp} \triangledown S_{\mathrm{rgh}}^{\sharp} = \underbrace{\delta_{0}}^{\mathrm{list}} & \underbrace{\delta_{1}} \\ (\alpha_{0}, \beta_{0}) & \stackrel{\Psi}{\longleftrightarrow} \delta_{0} \\ (\alpha_{1}, \beta_{1}) & \stackrel{\Psi}{\longleftrightarrow} \delta_{1} \end{cases}$$

### **Application to list traversal**, at the end of iteration 1:

previous invariant before iteration 1:



• join, before iteration 1:



$$\begin{cases}
\Psi(\alpha_0, \beta_0) = \delta_0 \\
\Psi(\alpha_1, \beta_2) = \delta_1
\end{cases}$$

## Over-approximation of union: rewrite system properties

- Comparison, canonicalization and widening algorithms can be considered rewriting systems over tuples of graphs
- Success configuration: weakening applies on all components, i.e., the inputs are fully "consumed" in the weakening process
- Failure configuration: some components cannot be weakened i.e., the algorithm should return the conservative answer (i.e.,  $\top$ )

#### **Termination**

- The systems are terminating
- This ensures comparison, canonicalization, widening are computable

### Non confluence!

- The results depends on the order of application of the rules
- Implementation requires the choice of an adequate strategy

## Over-approximation of union in the combined domain

## Widening of $(e_0^{\sharp}, S_0^{\sharp})$ and $(e_1^{\sharp}, S_1^{\sharp})$

- define  $\Psi$ , e by  $\Psi(\alpha, \beta) = e(\mathbf{x}) = \delta$  (where  $\delta$  is a fresh node) if and only if  $e_0^{\sharp}(\mathbf{x}) = \alpha \wedge e_1^{\sharp}(\mathbf{x}) = \beta$
- 2 iteratively apply join local rules, and extend  $\Psi$  when new relations are inferred (for instance for points-to edges)
- eturn the result obtained when all regions of both inputs are approximated in the output graph

This algorithm is sound:

### Soundness

$$\gamma(e_0^{\sharp}, S_0^{\sharp}) \cup \gamma(e_1^{\sharp}, S_1^{\sharp}) \subseteq \gamma(e^{\sharp}, S^{\sharp})$$

Widening also enforces **termination** (it only introduces segments, and the growth induced by the introduction of segments is bounded)

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# What assumptions do we make? How do we prove soundness of the analysis of a loop?

• Assumptions in the concrete level, and for block b:

$$(\mathcal{P}(\mathbb{M}),\subseteq)$$
 is a complete lattice, hence a CPO  $F:\mathcal{P}(\mathbb{M})\to\mathcal{P}(\mathbb{M})$  is the concrete semantic ("post") function of b

thus, the concrete semantics writes down as  $[b] = lfp_{\emptyset}F$ 

Assumptions in the abstract level:

set of abstract elements, no order a priori 
$$m^{\sharp} ::= (e^{\sharp}, S^{\sharp})$$
 concretization  $F^{\sharp} : \mathbb{M}^{\sharp} \to \mathbb{M}^{\sharp}$  sound abstract semantic function i.e., such that  $F \circ \gamma_{\mathrm{mem}} \subseteq \gamma_{\mathrm{mem}} \circ F^{\sharp}$  widening operator, terminates, and such that  $\gamma_{\mathrm{mem}}(m_0^{\sharp}) \cup \gamma_{\mathrm{mem}}(m_1^{\sharp}) \subseteq \gamma_{\mathrm{mem}}(m_0^{\sharp}) \subset \gamma_{\mathrm{mem}}(m_0^{\sharp})$ 

## Computing a loop abstract post-condition

### Loop abstract semantics

The abstract semantics of loop **while**(rand()){b} is calculated as the limit of the sequence of abstract iterates below:

$$\begin{cases}
 m_0^{\sharp} = \bot \\
 m_{n+1}^{\sharp} = m_n^{\sharp} \nabla F^{\sharp}(m_n^{\sharp})
\end{cases}$$

#### Soundness proof:

- by induction over n,  $\bigcup_{k \le n} F^k(\emptyset) \subseteq \gamma_{\text{mem}}(m_n^{\sharp})$
- by the property of widening, the abstract sequence converges at a rank N:  $\forall k \geq N, \ m_k^{\sharp} = m_N^{\sharp}$ , thus

$$\mathsf{lfp}_{\emptyset} F = \bigcup_{k} F^{k}(\emptyset) \subseteq \gamma_{\mathrm{mem}}(\mathit{m}_{N}^{\sharp})$$

## Discussion on the abstract ordering

How about the abstract ordering? We assumed NONE so far...

• Logical ordering, induced by concretization, used for proofs

$$m_0^\sharp \sqsubseteq m_1^\sharp \quad ::= \quad "\gamma_{\mathrm{mem}}(m_0^\sharp) \subseteq \gamma_{\mathrm{mem}}(m_1^\sharp)"$$

 Approximation of the logical ordering, implemented as a function is le:  $\mathbb{M}^{\sharp} \times \mathbb{M}^{\sharp} \to \{\text{true}, \top\}$ , used to test the convergence of abstract iterates

$$\mathsf{is}_{\mathsf{le}}(\mathit{m}_{\mathsf{0}}^\sharp, \mathit{m}_{\mathsf{1}}^\sharp) = \mathsf{true} \implies \gamma_{\mathrm{mem}}(\mathit{m}_{\mathsf{0}}^\sharp) \subseteq \gamma_{\mathrm{mem}}(\mathit{m}_{\mathsf{1}}^\sharp)$$

Abstract semantics is not assumed (and is actually most likely NOT) monotone with respect to either of these orders...

 Also, computational ordering would be used for proving widening termination

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# Separation logic

## Separation logic formulas (main connectors only)

#### **Concretization**:

$$\gamma(\mathsf{emp}) = \mathbb{E} \times \{[]\}$$
 $\gamma(\mathsf{TRUE}) = \mathbb{E} \times \mathbb{H}$ 
 $\gamma(\mathsf{1} \mapsto \mathsf{v}) = \{(e, [[\![1]\!](e, h) \mapsto \mathsf{v}]) \mid e \in \mathbb{E}\}$ 
 $\gamma(\mathsf{F}_0 * \mathsf{F}_1) = \{(e, h_0 \circledast h_1) \mid (e, h_0) \in \gamma(\mathsf{F}_0) \land (e, h_1) \in \gamma(\mathsf{F}_1)\}$ 
 $\gamma(\mathsf{F}_0 \land \mathsf{F}_1) = \gamma(\mathsf{F}_0) \cap \gamma(\mathsf{F}_1)$ 
 $\gamma(\mathsf{F}_0 - *\mathsf{F}_1) = \mathsf{exercise}$ 

#### Program reasoning: frame rule and strong updates

Xavier Rival (INRIA)

# Shape graphs and separation logic

**Shape graphs**: provide an efficient data-structure to describe a **subset** of separation logic predicates, and do static analysis with them.

Important addition: inductive predicates.

**Semantic preserving translation**  $\Pi$  of graphs into separation logic formulas:

Graph $S^\sharp \in \mathbb{D}^\sharp_sh$	Translated formula $\Pi(S^{\sharp})$
$ \begin{array}{c}                                     $	$\alpha \cdot \mathtt{f} \mapsto \beta$
$S_0^{\sharp}$ $S_1^{\sharp}$	$\Pi(S_0^\sharp) * \Pi(S_1^\sharp)$
$\alpha$ list	$lpha \cdot list$
$\bigcirc \qquad \qquad$	$lpha \cdot list\_endp(\delta)$
other inductives and segments	similar

#### Note that:

- shape graphs can be encoded into separation logic formula
- the opposite is usually not true

# Comparing the structure of abstract formulae

## Separation logic:

$$F_0 * F_1 * \ldots * F_n$$

- first the heap is partitioned
- each region is described separately
- some of the F<sub>i</sub> components may be summary predicates, describing unbounded regions
- reachability is implicit
- allows local reasoning

#### Three valued logic:

$$p_0 \wedge p_1 \wedge \ldots \wedge p_n$$

- first a conjunction of properties
- each predicate p<sub>i</sub> may talk about any heap region
- no direct heap partitioning
- reachability can be expressed (natively)
- no local reasoning

### Two very different sets of predicates

- one allows local reasoning, the other not
- the other way for reachability predicates

#### Large / unbounded numbers of concrete cells need to be abstracted

- Dynamic structures (lists, trees) have an unknown and unbounded number of cells, hence require summarization
- We also needed summaries to deal with arrays

#### Summary

A summary predicate allows to describe an unbounded number of memory locations using a fixed, finite set of predicates

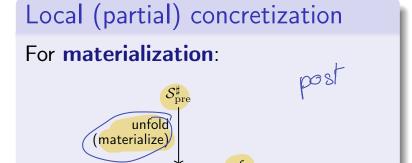
#### Principles underlying summarization:

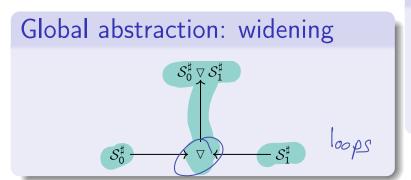
- in separation logic:
   using inductive definitions for lists, trees...
   unbounded size of the summarized region is hidden in the recursion
- in three-valued logic:
   summary nodes + high level predicates (such as reachability)
   one summary node carries the properties of an unbounded number of cells

# Concretize partially, update, abstract

#### For precise analysis, summaries need to be (temporarily) refined

#### Separation logic:



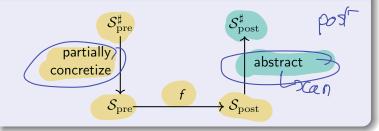


In both cases, two mechanisms are needed:

- refine summaries
- synthesize summaries

#### TVLA





### Outline

- Introduction
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  - Combined analysis algorithms

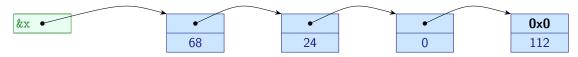
La dependent reduced product

6 Conclusion

# Shape and value properties

#### Common data-structures require to reason both about shape and data:

- hybrid stores: data stored next to inductive structures
- list of even elements:



• sorted list:



- list with a length constraint
- tries: binary trees with paths labelled with sequences of "0" and "1"
- balanced trees: red-black, AVL...

#### This part of the course:

- how to express both shape and numerical properties ?
- how to extend shape analysis algorithms

# Description of a sorted list

• Example: sorted list



#### Inductive definition

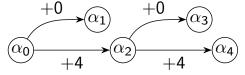
- Each element should be greater than the previous one
- The first element simply needs be greater than  $-\infty...$
- We need to propagate the lower bound, using a scalar parameter

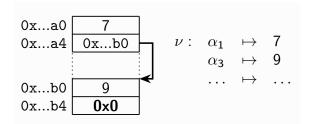
# Adding value information (here, numeric)

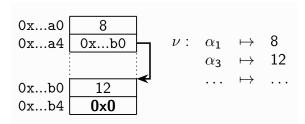
Concrete numeric values appear in the valuation thus the abstracting contents boils down to abstracting  $\nu$ !

**Example**: all lists of length 2, sorted in the increasing order of data fields

Memory abstraction:







**Abstraction of valuations**:  $\nu(\alpha_1) < \nu(\alpha_3)$ , can be described by the constraint  $\alpha_1 < \alpha_3$ 

# A first step towards a combined domain

#### Domains and their concretization:

• shape abstract domain  $\mathbb{D}_{sh}^{\sharp}$  of graphs abstract stores together with a physical mapping of nodes

$$\gamma_{\mathsf{sh}}: \mathbb{D}^\sharp_{\mathsf{sh}} o \mathcal{P}((\mathbb{D}^\sharp_{\mathsf{sh}} o \mathbb{M}) imes (\mathbb{V}^\sharp o \mathbb{V}))$$

ullet numerical abstract domain  $\mathbb{D}^{\sharp}_{\text{num}}$ , abstracts physical mapping of nodes

$$\gamma_{\mathsf{num}}: \mathbb{D}^{\sharp}_{\mathsf{num}} o \mathcal{P}(\mathbb{V}^{\sharp} o \mathbb{V})$$

## Combined domain [CR]

- ullet Set of abstract values:  $\mathbb{D}^{\sharp}=\mathbb{D}^{\sharp}_{\mathsf{sh}}\times\mathbb{D}^{\sharp}_{\mathsf{num}}$
- Concretization:

$$\gamma(\mathcal{S}^{\sharp}, \mathcal{N}^{\sharp}) = \{(\mathfrak{h}, \nu) \in \mathbb{M} \mid \nu \in \gamma_{\mathsf{num}}(\mathcal{N}^{\sharp}) \wedge (\mathfrak{h}, \nu) \in \gamma_{\mathsf{sh}}(\mathcal{S}^{\sharp})\}$$

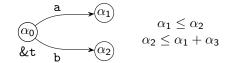
#### Can it be described as a reduced product?

- product abstraction:  $\mathbb{D}^{\sharp} = \mathbb{D}_{0}^{\sharp} \times \mathbb{D}_{1}^{\sharp}$  (componentwise ordering)
- concretization:  $\gamma(x_0, x_1) = \gamma(x_0) \cap \gamma(x_1)$
- **reduction**:  $\mathbb{D}_r^{\sharp}$  is the quotient of  $\mathbb{D}^{\sharp}$  by the equivalence relation  $\equiv$  defined by  $(x_0, x_1) \equiv (x'_0, x'_1) \iff \gamma(x_0, x_1) = \gamma(x'_0, x'_1)$

# Formalizing the product domain

#### The use of a simple reduced product raises several issues

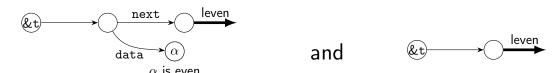
#### **Elements without a clear meaning:**



- this element exists in the reduced product domain (independent components)
- but, ... what is  $\alpha_3$  ?

#### Unclear comparison:

How can we compare the two elements below?



- in the reduced product domain, they are **not comparable**: nodes do not match, so componentwise comparison does not make sense
- when concretizing them, there is clear inclusion

# Towards a more adapted combination operator

#### Reason why the reduced product construction does not work well:

- the set of nodes / symbolic variables is not fixed
- the set of dimensions in the numerical domain depends on the shape abstraction
- ⇒ thus the product is not symmetric however, the reduced product construction is symmetric

#### Intuitions

- Graphs form a shape domain  $\mathbb{D}_{sh}^{\sharp}$
- For each graph  $S^{\sharp} \in \mathbb{D}^{\sharp}_{sh}$ , we have a numerical lattice  $\mathbb{D}^{\sharp}_{num(S^{\sharp})}$ 
  - example: if graph  $S^{\sharp}$  contains nodes  $\alpha_0, \alpha_1, \alpha_2$ ,  $\mathbb{D}^{\sharp}_{\mathsf{num}(S^{\sharp})}$  should abstract  $\{\alpha_0, \alpha_1, \alpha_2\} \to \mathbb{V}$
- An abstract value is a pair  $(S^{\sharp}, N^{\sharp})$ , such that  $N^{\sharp} \in \mathbb{D}^{\sharp}_{\operatorname{num}(N^{\sharp})}$

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## Cofibered domain

## Definition, for shape + num

- Basis: abstract domain  $(\mathbb{D}_{\mathsf{sh}}^\sharp, \sqsubseteq^\sharp)$ , with concretization  $\gamma_{\mathsf{sh}}: \mathbb{D}_{\mathsf{sh}}^\sharp \to \mathbb{D}$
- Function:  $\phi: \mathbb{D}_{\mathsf{sh}}^{\sharp} \to \mathcal{D}$ , where each element of  $\mathcal{D}$  is an abstract domain instance  $(\mathbb{D}_{\mathsf{num}}^{\sharp}, \sqsubseteq_{\mathsf{num}}^{\sharp})$ , with a concretization  $\gamma_{\mathsf{num}}: \mathbb{D}_{\mathsf{num}}^{\sharp} \to \mathbb{D}$  (tied to a shape graph)
- Domain  $\mathbb{D}^{\sharp}$ : set of pairs  $(S^{\sharp}, N^{\sharp})$  where  $N^{\sharp} \in \phi(S^{\sharp})$
- Concretization:  $\gamma(S^{\sharp}, N^{\sharp}) = \gamma(S^{\sharp}) \cap \gamma(N^{\sharp})$
- Lift functions:  $\forall S_0^{\sharp}, S_1^{\sharp} \in \mathbb{D}_{\operatorname{sh}}^{\sharp}$ , such that  $S_0^{\sharp} \sqsubseteq^{\sharp} S_1^{\sharp}$ , there exists a function  $\Pi_{S_0^{\sharp}, S_1^{\sharp}} : \phi(S_0^{\sharp}) \to \phi(S_1^{\sharp})$ , that is monotone for  $\gamma_{S_2^{\sharp}}$  and  $\gamma_{S_2^{\sharp}}$
- $S_1^\sharp$   $\mathbb{D}_{\mathsf{num}}^\sharp\langle S_1^\sharp 
  angle$   $\mathbb{D}_{\mathsf{num}}^\sharp\langle S_0^\sharp 
  angle$

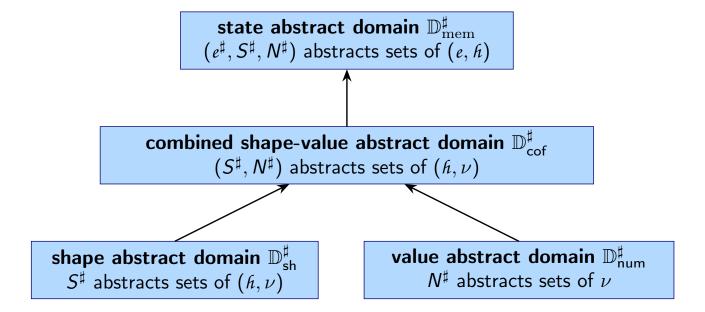
 $\mathbb{D}_{\mathsf{num}}^{\sharp}\langle S_2^{\sharp}\rangle$ 

- General construction presented in [AV](Arnaud Venet)
- Intuition: a dependent domain product

#### Overall abstract domain structure

## Implementation exploiting the modular structure

- Each layer accounts for one aspect of the concrete states
- Each layer boils down to a module or functor in ML



How about operations, transfer functions? Also to be modularly defined

Xavier Rival (INRIA)

## Domain operations

The cofibered structure allows to define **standard domain operations**:

- ift functions allow to switch domain when needed
- computations first done in the basis, then in the numerical domains, after lifting, when needed

Comparison of 
$$(S_0^{\sharp}, N_0^{\sharp})$$
 and  $(S_1^{\sharp}, N_1^{\sharp})$ 

- First, compare  $S_0^{\sharp}$  and  $S_1^{\sharp}$  in  $\mathbb{D}_{\mathsf{sh}}^{\sharp}$
- 2 If  $S_0^{\sharp} \sqsubseteq^{\sharp} S_1^{\sharp}$ , compare  $\Pi_{S_0^{\sharp}, S_1^{\sharp}}(N_0^{\sharp})$  and  $N_1^{\sharp}$

# Widening of $(S_0^{\sharp}, N_0^{\sharp})$ and $(S_1^{\sharp}, N_1^{\sharp})$

- First, compute the widening in the basis  $S^{\sharp} = S_0^{\sharp} \triangledown S_1^{\sharp}$
- Then move to  $\phi(S^{\sharp})$ , by computing  $N_{0c}^{\sharp} = \Pi_{S_0^{\sharp},S^{\sharp}}(N_0^{\sharp})$  and  $N_{1c}^{\sharp} = \Pi_{S_1^{\sharp},S^{\sharp}}(N_1^{\sharp})$
- Last widen in  $\phi(S^{\sharp})$ :  $N^{\sharp} = N_{0c}^{\sharp} \nabla_{S^{\sharp}} N_{1c}^{\sharp}$

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## Domain operations and transfer functions

#### Abstract assignments, condition tests:

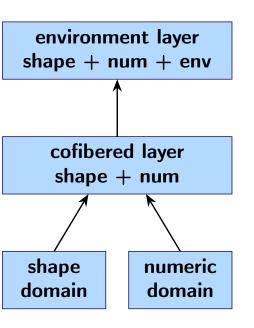
- need to modify both the shape abstraction and the value abstraction
- both modification are interdependent

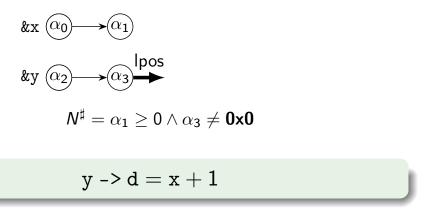
## Typical process to compute abstract post-conditions

- compute the post in the shape abstract domain and update the basis
- update the value abstraction (numerics) to model dimensions additions and removals
- 3 compute the post in the value abstract domain

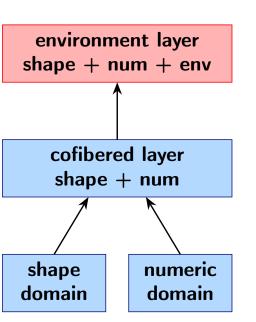
#### Proofs of soundness of transfer functions rely on:

- the soundness of the lift functions
- the soundness of both domain transfer functions





**Abstract post-condition?** 



&x 
$$\alpha_0$$
  $\alpha_1$ 

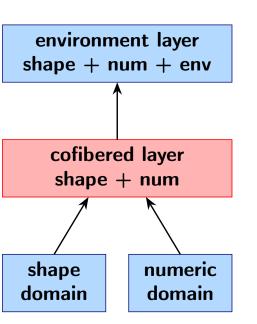
&y  $\alpha_2$   $\alpha_3$   $\alpha_3$ 
 $N^{\sharp} = \alpha_1 \ge 0 \land \alpha_3 \ne 0 \times 0$ 

$$y \rightarrow d = x + 1 \Rightarrow (*\alpha_2) \cdot d = (*\alpha_0) + 1$$

**Abstract post-condition?** 

## Stage 1: environment resolution

• replaces x with  $*e^{\sharp}(x)$ 



&x 
$$\alpha_0$$
  $\alpha_1$ 

&y  $\alpha_2$   $\alpha_3$   $\alpha_3$   $\alpha_3$   $\alpha_3$   $\alpha_3$   $\alpha_4$ 

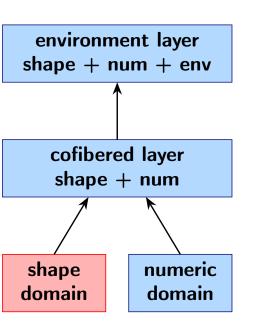
$$N^{\sharp} = \alpha_1 \ge 0 \land \alpha_3 \ne \mathbf{0} \times \mathbf{0}$$

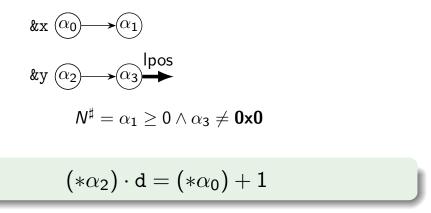
$$(*\alpha_2) \cdot d = (*\alpha_0) + 1$$

**Abstract post-condition?** 

# Stage 2: propagate into the shape + numerics domain

• only symbolic nodes appear

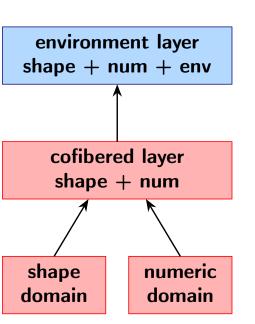




**Abstract post-condition?** 

## Stage 3: resolve cells in the shape graph abstract domain

- $*\alpha_0$  evaluates to  $\alpha_1$ ;  $*\alpha_2$  evaluates to  $\alpha_3$
- $(*\alpha_2) \cdot d$  fails to evaluate: no points-to out of  $\alpha_3$



&x 
$$\alpha_0 \longrightarrow \alpha_1$$
&y  $\alpha_2 \longrightarrow \alpha_3 \xrightarrow{\mathsf{lpos}}$ 

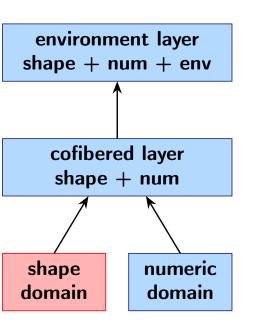
$$N^{\sharp} = \alpha_1 \ge 0 \land \alpha_3 \ne \mathbf{0x0}$$

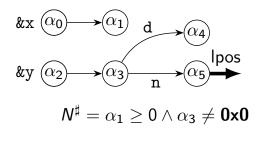
$$(*\alpha_2) \cdot \mathsf{d} = (*\alpha_0) + 1$$

**Abstract post-condition?** 

# Stage 4 (a): unfolding triggered

- the analysis needs to locally materialize  $\alpha_3 \cdot lpos...$
- thus, unfolding starts at symbolic variable  $\alpha_3$



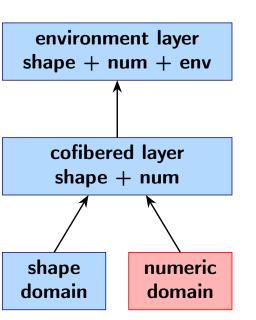


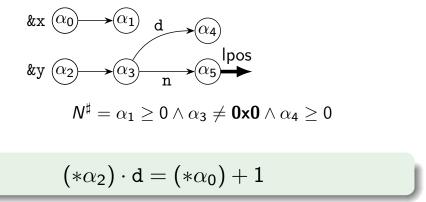
$$(*\alpha_2) \cdot d = (*\alpha_0) + 1$$

**Abstract post-condition?** 

## Stage 4 (b): unfolding, shape part

- unfolding of the memory predicate part
- numerical predicates still need be taken into account

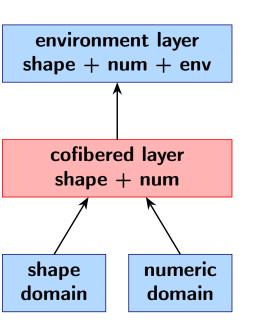


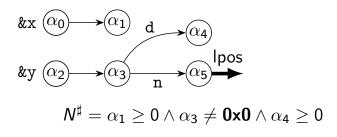


**Abstract post-condition?** 

## Stage 4 (c): unfolding, numeric part

- numerical predicates taken into account
- I-value  $\alpha_3 \cdot d$  now evaluates into edge  $\alpha_3 \cdot d \mapsto \alpha_4$





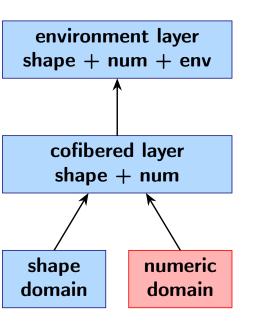
#### create node $\alpha_6$

&x 
$$\alpha_0$$
  $\alpha_1$  d  $\alpha_4$   $\alpha_6$  &y  $\alpha_2$   $\alpha_3$   $\alpha_5$   $\alpha_5$ 

$$N^{\sharp} = \alpha_1 \geq 0 \wedge \alpha_3 \neq \mathbf{0} \times \mathbf{0} \wedge \alpha_4 \geq 0$$

## Stage 5: create a new node

• new node  $\alpha_6$  denotes a new value will store the new value



&x 
$$\alpha_0$$
  $\alpha_1$  d  $\alpha_4$  lpos  $\alpha_2$   $\alpha_3$   $\alpha_4$   $\alpha_5$   $\alpha_5$   $\alpha_4$   $\alpha_4$ 

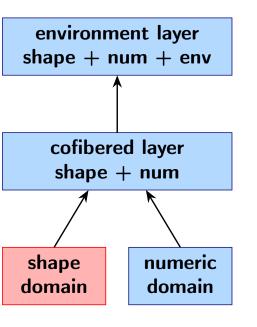
$$\alpha_6 \leftarrow \alpha_1 + 1$$
 in numerics

&x 
$$\alpha_0$$
  $\alpha_1$  d  $\alpha_4$   $\alpha_6$  &y  $\alpha_2$   $\alpha_3$   $\alpha_5$   $\alpha_5$   $\alpha_6$ 

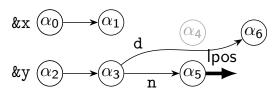
$$N^{\sharp} = \alpha_1 \geq 0 \wedge \alpha_3 \neq \mathbf{0} \times \mathbf{0} \wedge \alpha_4 \geq 0 \wedge \alpha_6 \geq \mathbf{1}$$

## Stage 6: perform numeric assignment

 numeric assignment completely ignores pointer structures to the new node



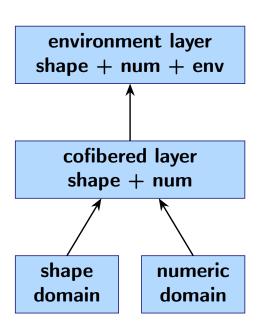
mutate 
$$(\alpha_3 \cdot d) \mapsto \alpha_4$$
 into  $\alpha_6$ 

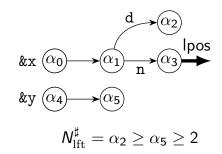


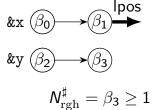
$$N^{\sharp} = \alpha_1 > 0 \wedge \alpha_3 \neq \mathbf{0} \times \mathbf{0} \wedge \alpha_4 > 0 \wedge \alpha_6 > 1$$

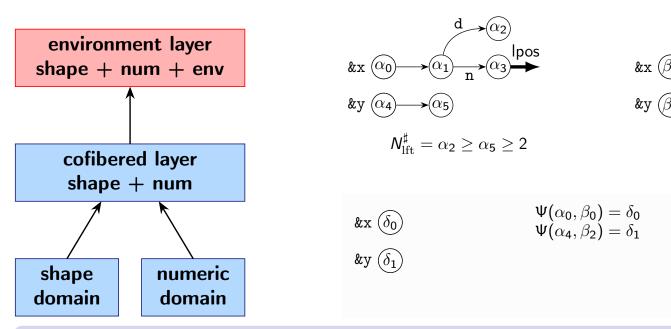
## Stage 7: perform the update in the graph

- classic strong update in a pointer aware domain
- symbolic node  $\alpha_4$  becomes redundant and can be removed



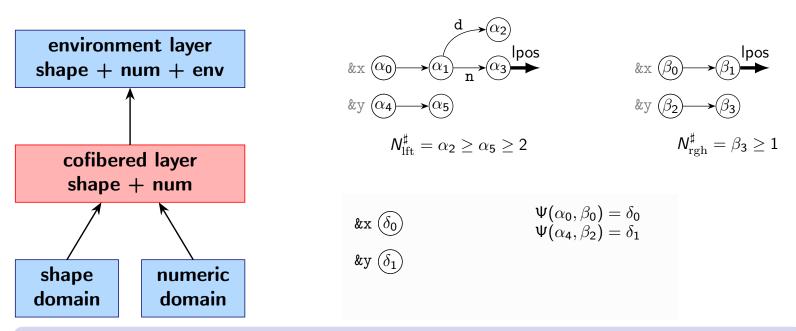






## Stage 1: abstract environment

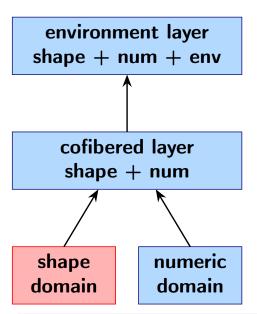
• compute new abstract environment and initial node relation e.g.,  $\alpha_0$ ,  $\beta_0$  both denote &x

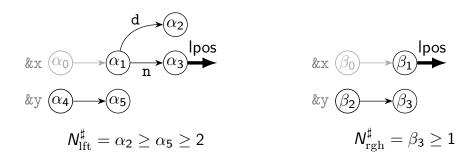


## Stage 2: join in the "cofibered" layer

operations to perform:

- o compute the join in the graph
- 2 convert value abstractions, and join the resulting lattice

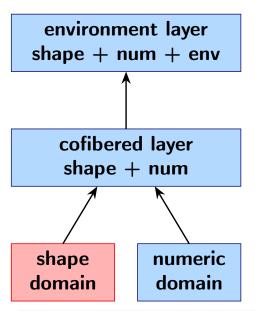


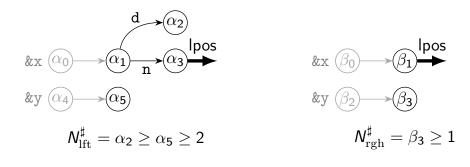




# Stage 2: graph join

- apply local join rules ex: points-to matching, weakening to inductive...
- incremental algorithm

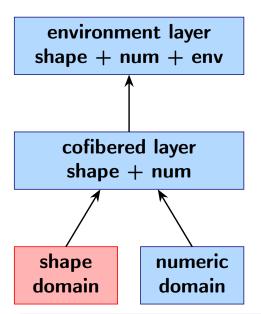


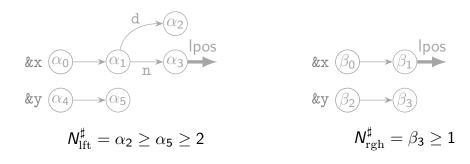


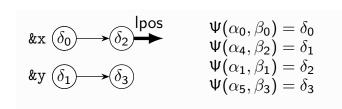


# Stage 2: graph join

- apply local join rules ex: points-to matching, weakening to inductive...
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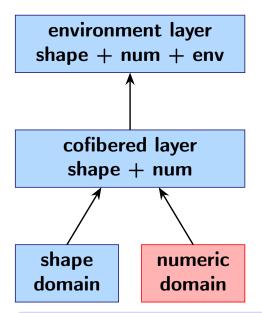


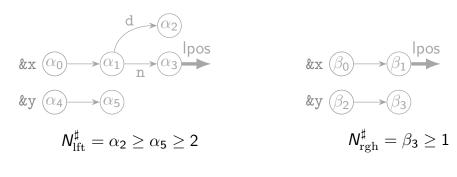


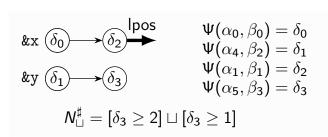


# Stage 2: graph join

- apply local join rules
   ex: points-to matching, weakening to inductive...
- incremental algorithm

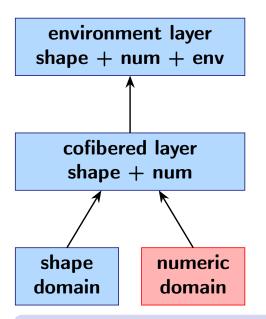


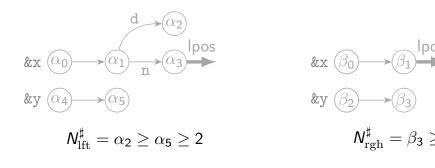


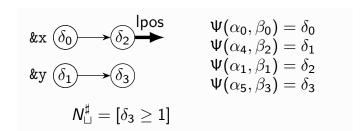


## Stage 3: conversion function application in numerics

- remove nodes that were abstracted away
- rename other nodes







## Stage 4: join in the numeric domain

apply 
 □ for regular join, 
 ▽ for a widening

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## Updates and summarization

Weak updates cause significant precision loss...
Separation logic makes updates strong

## Separation logic

Separating conjunction combines properties on disjoint stores

- Fundamental idea: \* forces to identify what is modified
- Before an update (or a read) takes place, memory cells need to be materialized
- Local reasoning: properties on unmodified cells pertain

#### **Summaries**

Inductive predicates describe unbounded memory regions

• Last lecture: array segments and transitive closure (TVLA)

# Bibliography

S Frame Rule

- [JR]: Separation Logic: A Logic for Shared Mutable Data Structures. John C. Reynolds. In LICS'02, pages 55–74, 2002.
- [DHY]: A Local Shape Analysis Based on Separation Logic.
   Dino Distefano, Peter W. O'Hearn and Hongseok Yang.
   In TACAS'06, pages 287–302.
- [CR]: Relational inductive shape analysis. Bor-Yuh Evan Chang and Xavier Rival. In POPL'08, pages 247–260, 2008.

# Assignment and paper reading

#### The Frame rule:

- formalize the Hoare logic rules for a language with pointer assignments and condition tests
- prove the Frame rule by induction over the syntax of programs

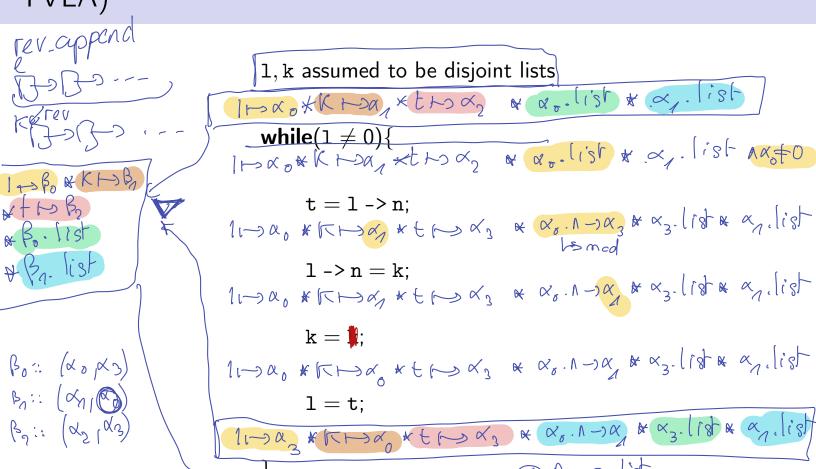
#### **Reading:**

Separation Logic: A Logic for Shared Mutable Data Structures. John C. Reynolds.

In LICS'02, pages 55-74, 2002.

Formalizes the Frame rule, among others

# Assignment: a simple analysis in Separation Logic (after TVLA)



z Hodo x= malloc (4) x Hodo x Hodo

L. list = 
L. list (Z)

Symb. Set

Huisong Li SAS116