

# 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: separation logic based shape analyses

- **separating conjunction connector**  $*$ : ties properties that characterize **disjoint memory regions**
- also **many other connectors**:  
disjunctions, classical conjunctions, separating implication...
- can be turned into **an abstract domain**

# Properties to verify: examples

## A program closing a list of file descriptors

```
//l points to a list
c = l;
while(c ≠ NULL){
  close(c → FD);
  c = c → next;
}
```

## Correctness properties

- 1 memory safety
- 2 1 is supposed to store all file descriptors at all times  
will its structure be preserved ?  
**yes**, no breakage of a next link
- 3 closure of all the descriptors

## Examples of structure preservation properties

- algorithms manipulating **trees**, **lists**...
- libraries of algorithms on **balanced trees**
- **not guaranteed by the language** !  
e.g., the balancing of Maps in the OCaml standard library was **incorrect** for years (performance bug)

# On today's agenda

## Another important family of shape analysis abstractions:

- **three valued logic** based abstraction
  - maps predicates into “true”, “false”, “maybe” logical values
- can describe **memory states** (in this course)
  - but also **other objects** (not in this course)
- useful **comparison** with separation logic based abstraction

## Combination with value abstraction:

- so far, we have considered **pointer information only**
- real states also include **numerical** and **boolean values**, but also **strings** and others...
- **issue 1**: shape abstractions are very **dynamic**
  - e.g., the scope of summaries varies during the analysis
- **issue 2**: exchange information between shape and value

# Outline

- 1 Introduction
- 2 Setup (reminder)
  - Syntax and semantics
  - Basic pointer abstractions
- 3 Shape analysis in Three-Valued Logic (TVL)
- 4 Combining shape and value abstractions
- 5 Conclusion

# Assumptions: syntax of programs

<b>l</b>	<b>::= l-values</b>	
	<b>x</b>	( $x \in \mathbb{X}$ )
	<b>*e</b>	pointer dereference
	<b>l · f</b>	field read
		<b>pointers, array dereference...</b>
<b>e</b>	<b>::= expressions</b>	
	<b>c</b>	( $c \in \mathbb{V}$ )
	<b>l</b>	(l-value)
	<b>e <math>\oplus</math> e</b>	(arith operation, comparison)
	<b>&amp;l</b>	"address of" operator
<b>s</b>	<b>::= statements</b>	
	<b>l = e</b>	(assignment)
	<b>s; ... s;</b>	(sequence)
	<b>if(e){s}</b>	(condition)
	<b>while(e){s}</b>	(loop)
	<b>x = malloc(c)</b>	allocation of c bytes
	<b>free(x)</b>	deallocation of the block pointed to by

# Semantic domains

## No one-to-one relation between memory cells and program variables

- a variable may correspond to **several cells** (structures...)
- **dynamically allocated cells** correspond to no variable at all...

Thus, we distinguish memory contents and variable addresses:

## Environment + Heap

- **Addresses** are values:  $\mathbb{V}_{\text{addr}} \subseteq \mathbb{V}$
- **Environments**  $e \in \mathbb{E}$  map variables into their addresses
- **Heaps** ( $h \in \mathbb{H}$ ) map addresses into values

$$\mathbb{E} = \mathbb{X} \rightarrow \mathbb{V}_{\text{addr}}$$

$$\mathbb{H} = \mathbb{V}_{\text{addr}} \rightarrow \mathbb{V}$$

$h$  is actually only a partial function

- **Memory states** (or **memories**):  $\mathbb{M} = \mathbb{E} \times \mathbb{H}$

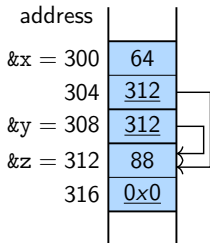
Note: **Avoid confusion between heap (function from addresses to values) and dynamic allocation space (often referred to as “heap”)**

# Example of a concrete memory state (variables)

- $x$  and  $z$  are two list elements containing values 64 and 88, and where the former points to the latter
- $y$  stores a pointer to  $z$

## Memory layout

(pointer values underlined)



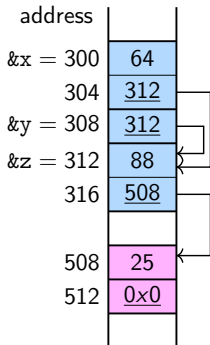
$e :$	$x$	$\mapsto$	300
	$y$	$\mapsto$	308
	$z$	$\mapsto$	312
$h :$	300	$\mapsto$	64
	304	$\mapsto$	312
	308	$\mapsto$	312
	312	$\mapsto$	88
	316	$\mapsto$	0



# Example of a concrete memory state (variables + dyn. cell)

- same configuration
- +  $z$  points to a dynamically allocated list element (in purple)

## Memory layout



$e$  :

x	↦	300
y	↦	308
z	↦	312

$h$  :

300	↦	64
304	↦	312
308	↦	312
312	↦	88
316	↦	508
508	↦	25
512	↦	0

# Semantics of the pointer operations

**Case of l-values:**  $\llbracket \mathbf{l} \rrbracket : \mathbb{M} \rightarrow \mathbb{V}_{\text{addr}}$

$$\begin{aligned} \llbracket \mathbf{x} \rrbracket(e, h) &= e(\mathbf{x}) \\ \llbracket *e \rrbracket(e, h) &= \begin{cases} h(\llbracket e \rrbracket(e, h)) & \text{if } \llbracket e \rrbracket(e, h) \neq 0 \wedge \llbracket e \rrbracket(e, h) \in \mathbf{Dom}(h) \\ \Omega & \text{otherwise} \end{cases} \\ \llbracket \mathbf{l} \cdot \mathbf{f} \rrbracket(e, h) &= \llbracket \mathbf{l} \rrbracket(e, h) + \mathbf{offset}(\mathbf{f}) \text{ (numeric offset)} \end{aligned}$$

**Case of expressions:**  $\llbracket e \rrbracket : \mathbb{M} \rightarrow \mathbb{V}$ , mostly unchanged

$$\begin{aligned} \llbracket \mathbf{l} \rrbracket(e, h) &= h(\llbracket \mathbf{l} \rrbracket(e, h)) && \text{(evaluates into the contents)} \\ \llbracket \&\mathbf{l} \rrbracket(e, h) &= \llbracket \mathbf{l} \rrbracket(e, h) && \text{(evaluates into the address)} \end{aligned}$$

**Case of statements** that are specific to memory operations:

- **memory allocation**  $\mathbf{x} = \mathbf{malloc}(c)$ :  $(e, h) \rightarrow (e, h')$  where  $h' = h[e(\mathbf{x}) \leftarrow k] \uplus \{k \mapsto v_k, k+1 \mapsto v_{k+1}, \dots, k+c-1 \mapsto v_{k+c-1}\}$  and  $k, \dots, k+c-1$  are fresh and unused in  $h$
- **memory deallocation**  $\mathbf{free}(\mathbf{x})$ :  $(e, h) \rightarrow (e, h')$  where  $k = e(\mathbf{x})$  and  $h = h' \uplus \{k \mapsto v_k, k+1 \mapsto v_{k+1}, \dots, k+c-1 \mapsto v_{k+c-1}\}$

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# Pointer non relational abstractions

## Assumption on the set of values:

- $\mathbb{V} = \mathbb{V}_{\text{addr}} \uplus \dots$  and  $\mathbb{X} = \mathbb{X}_{\text{addr}} \uplus \dots$
- pointer values ( $\mathbb{V}_{\text{addr}}$ ) describe (either symbolic or numerical) memory addresses
- base values may include integers and other base types
- **abstract cells**  $\mathbb{C}^\sharp$  finitely summarize concrete cells, through a **fixed**

$$\phi : \mathbb{V}_{\text{addr}} \longrightarrow \mathbb{C}^\sharp$$

- we apply a **non relational abstraction**:

## Non relational pointer abstraction

- Set of **pointer abstract values**  $\mathbb{D}_{\text{ptr}}^\sharp$
- **Concretization**  $\gamma_{\text{ptr}} : \mathbb{D}_{\text{ptr}}^\sharp \rightarrow \mathcal{P}(\mathbb{V}_{\text{addr}})$  into pointer sets
- **Abstract memory states** of the form  $\mathbb{C}^\sharp \rightarrow \mathbb{D}_{\text{ptr}}^\sharp$  with  
 $\gamma(m^\sharp) = \{(e, h) \mid \forall p \in \mathbb{X}_{\text{addr}}, h(e(p)) \in \gamma_{\text{ptr}} \circ m^\sharp \circ \phi(e(p))\}$

# Pointer non relational abstraction: null pointers

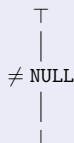
**The dereference of a null pointer will cause a crash**

To establish **safety**: compute **which pointers may be null**

## Null pointer analysis

### Abstract domain for addresses:

- $\gamma_{\text{ptr}}(\perp) = \emptyset$
- $\gamma_{\text{ptr}}(\top) = \mathbb{V}_{\text{addr}}$
- $\gamma_{\text{ptr}}(\neq \text{NULL}) = \mathbb{V}_{\text{addr}} \setminus \{0\}$



- we may also use a lattice with a fourth element = **NULL**  
**exercise**: what do we gain using this lattice ?
- very **lightweight**, can typically resolve rather trivial cases
- useful for **C**, but also for **Java**
- we can define very similar abstractions to deal with dangling or invalid pointers

# Pointer non relational abstraction: points-to sets

## Determine where a pointer may store a reference to

```

1: int x, y;
2: int * p;
3: y = 9;
4: p = &x;
5: *p = 0;

```

- what is the final value for `x` ?  
0, since **it is modified at line 5**...
- what is the final value for `y` ?  
9, since **it is not modified at line 5**...

## Basic pointer abstraction

- We assume a set of **abstract memory locations**  $\mathbb{A}^\#$  is fixed:

$$\mathbb{A}^\# = \{\&x, \&y, \dots, \&t, a_0, a_1, \dots, a_N\}$$

- **Concrete addresses** are **abstracted into**  $\mathbb{A}^\#$  by  $\phi_{\mathbb{A}} : \mathbb{A} \rightarrow \mathbb{A}^\# \uplus \{\top\}$
- A pointer value is abstracted by the abstraction of the addresses it may point to, *i.e.*,  $\mathbb{D}_{\text{ptr}}^\# = \mathcal{P}(\mathbb{A}^\#)$   
and  $\gamma_{\text{ptr}}(a^\#) = \{a \in \mathbb{A} \mid \phi_{\mathbb{A}}(a) = a^\#\}$

- **example:** `p` may point to  $\{\&x\}$

# Points-to sets computation example

## Example code:

```

1: int x, y;
2: int * p;
3: y = 9;
4: p = &x;
5: *p = 0;
6: ...

```

Abstract locations:  $\{\&x, \&y, \&p\}$

Analysis results:

	$\&x$	$\&y$	$\&p$
1	$\top$	$\top$	$\top$
2	$\top$	$\top$	$\top$
3	$\top$	$\top$	$\top$
4	$\top$	$[9, 9]$	$\top$
5	$\top$	$[9, 9]$	$\{\&x\}$
6	$[0, 0]$	$[9, 9]$	$\{\&x\}$

# Points-to sets computation and imprecision

```

x ∈ [-10, -5]; y ∈ [5, 10]
1: int * p;
2: if(?) {
3:   p = &x;
4: } else {
5:   p = &y;
6: }
7: *p = 0;
8: ...

```

- What is the final range for x ?
- What is the final range for y ?

**Abstract locations:**  $\{\&x, \&y, \&p\}$

	$\&x$	$\&y$	$\&p$
1	$[-10, -5]$	$[5, 10]$	$\top$
2	$[-10, -5]$	$[5, 10]$	$\top$
3	$[-10, -5]$	$[5, 10]$	$\top$
4	$[-10, -5]$	$[5, 10]$	$\{\&x\}$
5	$[-10, -5]$	$[5, 10]$	$\top$
6	$[-10, -5]$	$[5, 10]$	$\{\&y\}$
7	$[-10, -5]$	$[5, 10]$	$\{\&x, \&y\}$
8	$[-10, 0]$	$[0, 10]$	$\{\&x, \&y\}$

## Imprecise results

- The abstract information about both x and y are weakened
- The fact that  $x \neq y$  is lost



# Weak-updates

As in array analysis, we encounter:

## Weak updates

- **The modified concrete cell cannot be uniquely mapped into a well identified abstract cell that describes only it**
- The resulting abstract information is obtained by **joining the new value and the old information**

**Effect in pointer analysis**, in the case of an **assignment**:

- if the points-to set contains **exactly one element**, the analysis can perform a **strong update**
- if the points-to set may contain **more than one element**, the analysis needs to perform a **weak-update**

**Consequence:** **weak updates cause severe losses in precision**

# Previous course about memory abstraction: separation logic

Key idea:

**Avoid weak updates by localizing memory accesses (read or write) in a very precise manner, and with no ambiguity**

**Logical items:**

- **separating conjunction connector**:  
logically, splits the memory into two **disjoint** regions
- **basic predicates**, to describe individual cells
- **inductive summary predicates**, that describe unbounded memory regions

**Main algorithms:**

- **unfolding**: to refine summary predicates
- **folding**: to synthesize summary predicates

**Today**: compare separation logic with another shape abstraction and augment shape analysis to describe value properties

# Outline

- 1 Introduction
- 2 Setup (reminder)
- 3 Shape analysis in Three-Valued Logic (TVL)
  - Principles of Three-Valued Logic based abstraction
  - Comparing and concretizing Three-Valued Logic abstractions
  - Weakening Three-Valued Logic abstractions
  - Transfer functions
  - Focusing
  - Comparing Separation Logic and Three-Valued logic abstractions
- 4 Combining shape and value abstractions
- 5 Conclusion

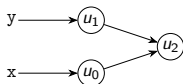
# Representation of memory states: memory graphs

## Observation: representation of memory states by graphs

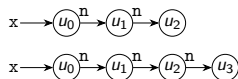
- **Nodes** (aka, atoms) denote **variables, memory locations**
- **Edges** denote **properties of addresses / pointers**, such as:
  - ▶ “field  $f$  of location  $u$  points to  $v$ ”
  - ▶ “variable  $x$  is stored at location  $u$ ”
- This representation is also relevant in the case of **separation logic** based shape abstraction

## A couple of examples:

### Two alias pointers:



### A list of length 2 or 3:



We need to over-approximate **sets of shape graphs**

# Memory graphs and predicates: variables

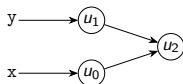
Before we apply some abstraction, we **formalize memory graphs** using some **predicates**, such as:

## “Variable content” predicate

We note  $x(u) = 1$  if node  $u$  represents the contents of  $x$ .

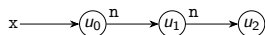
### Examples:

- **Two alias pointers:**



Then, we have  $x(u_0) = 1$  and  $y(u_1) = 1$ , and  $x(u) = 0$  (*resp.*,  $y(u) = 0$ ) in all the other cases

- **A list of length 2:**



Then, we have  $x(u_0) = 1$  and  $x(u) = 0$  in all the other cases

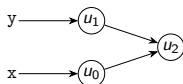
# Memory graphs and predicates: (field) pointers

## “Field content pointer” predicate

- We note  $\mathfrak{n}(u, v)$  if the field  $\mathfrak{n}$  of  $u$  stores a pointer to  $v$
- We note  $\underline{0}(u, v)$  if  $u$  stores a pointer to  $v$  (base address field is at offset 0)

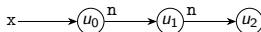
### Examples:

- **Two alias pointers:**



Then, we have  $\underline{0}(u_0, u_2) = 1$  and  $\underline{0}(u_1, u_2) = 1$ , and  $\underline{0}(u, v) = 0$  in all the other cases

- **A list of length 2:**



Then, we have  $\mathfrak{n}(u_0, u_1) = 1$  and  $\mathfrak{n}(u_1, u_2) = 1$ , and  $\mathfrak{n}(u, v) = 0$  in all the other cases

## 2-structures and concretization

We can represent the memory graphs using **tables of predicate values**:

### Two-structures and concretization

We assume a set  $\mathcal{P} = \{p_0, p_1, \dots, p_n\}$  of **predicates** (we write  $k_i$  for the arity of predicate  $p_i$ ). A formal representation of a memory graph is a **2-structure**  $(\mathcal{U}, \phi) \in \mathbb{D}_2^\#$  defined by:

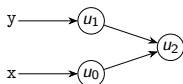
- a set  $\mathcal{U} = \{u_0, u_1, \dots, u_m\}$  of **atoms**
- a **truth table**  $\phi$  such that  $\phi(p_i, u_{l_1}, \dots, u_{l_{k_i}})$  denotes the truth value of  $p_i$  for  $u_{l_1}, \dots, u_{l_{k_i}}$

Then,  $\gamma_2(\mathcal{U}, \phi)$  is the set of  $(e, h, \nu)$  where  $\nu : \mathcal{U} \rightarrow \mathbb{V}_{\text{addr}}$  and that satisfy exactly the truth tables defined by  $\phi$ :

- $(e, h, \nu)$  satisfies  $x(u)$  iff  $e(x) = \nu(u)$
- $(e, h, \nu)$  satisfies  $f(u, v)$  iff  $h(\nu(u), f) = \nu(v)$
- the name “two-structure” will become clear (very) soon
- the set of two-structures is parameterized by the data of a set of predicates  $x(\cdot), y(\cdot), \underline{0}(\cdot, \cdot), n(\cdot, \cdot)$  (additional predicates will be added soon...)

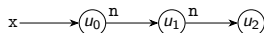
# Examples of two-structures

## Two alias pointers:



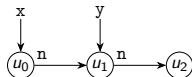
	x	y	$\mapsto$	$u_0$	$u_1$	$u_2$
$u_0$	1	0	$u_0$	0	0	1
$u_1$	0	1	$u_1$	0	0	1
$u_2$	0	0	$u_2$	0	0	0

## A list of length 2:



	x	$\cdot n \mapsto$	$u_0$	$u_1$	$u_2$
$u_0$	1	$u_0$	0	1	0
$u_1$	0	$u_1$	0	0	1
$u_2$	0	$u_2$	0	0	0

## A list of length 2:



	x	y	$\cdot n \mapsto$	$u_0$	$u_1$	$u_2$
$u_0$	1	0	$u_0$	0	1	0
$u_1$	0	1	$u_1$	0	0	1
$u_2$	0	0	$u_2$	0	0	0

Lists of **arbitrary length** ? More on this **later**

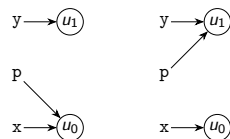


# Unknown value: three valued logic

## How to abstract away some information ?

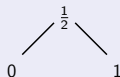
*i.e.*, how to abstract several graphs into one ?

**Example:** pointer variable  $p$  alias with  $x$  or  $y$

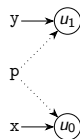


## A boolean lattice

- Use **predicate tables**
- Add a  $\top$  boolean value;  
(denoted to by  $\frac{1}{2}$  in TVLA papers)



- **Graph representation:**  
**dotted edges**
- **Abstract graph:**



## Summary nodes

At this point, we cannot talk about **unbounded memory states** with **finitely many** nodes, since one node represents at most one memory cell

### An idea

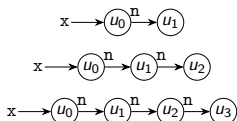
- Choose a node to represent **several** concrete nodes
- Similar to **smashing** of arrays using segments

### Definition: summary node

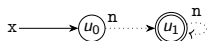
A **summary node** is an atom that may denote several concrete atoms

- intuition: we are using a **non injective function**  $\phi_{\Delta} : \Delta \longrightarrow \Delta^{\#}$
- representation: double circled nodes

### Lists of lengths 1, 2, 3:



Attempt at a **summary** graph:



- Edges to  $u_1$  are dotted

## Additional graph predicate: sharing

We now define a few **higher level predicates** based on the previously seen **atomic predicates** describing the graphs.

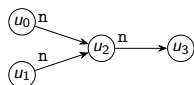
Example: a cell is **shared** if and only if there exists several distinct pointers to it

### “Is shared” predicate

The predicate  $\underline{sh}(u)$  holds if and only if

$$\exists v_0, v_1, \left\{ \begin{array}{l} v_0 \neq v_1 \\ \wedge \quad n(v_0, u) \\ \wedge \quad n(v_1, u) \end{array} \right.$$

(for concision, we assume only  $n$  pointers)



- $\underline{sh}(u_0) = \underline{sh}(u_1) = \underline{sh}(u_3) = 0$
- $\underline{sh}(u_2) = 1$

## Additional graph predicate: reachability

We can also define higher level predicates **using induction**:

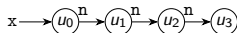
For instance, a cell is **reachable** from  $u$  if and only if it is  $u$  or it is reachable from a cell pointed to by  $u$ .

### “Reachability” predicate

The predicate  $\underline{r}(u, v)$  holds if and only if:

$$u = v \vee \exists u_0, n(u, u_0) \wedge \underline{r}(u_0, v)$$

(for concision, we assume only  $n$  pointers)



- $\underline{r}(u_1, u_0) = \underline{r}(u_2, u_0) = \underline{r}(u_3, u_1) = 0$
- $\underline{r}(u_0, u_0) = \underline{r}(u_0, u_2) = \underline{r}(u_0, u_3) = 1$

### “Acyclicity” predicate

The predicate  $\underline{acy}(u)$  holds if and only if  $\underline{r}(u, u)$  does not hold

## Three structures

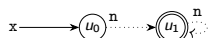
As for 2-structures, we assume a set  $\mathcal{P} = \{p_0, p_1, \dots, p_n\}$  of **predicates** fixed and write  $k_i$  for the arity of predicate  $p_i$ .

### Definition: 3-structures

A **3-structure** is a tuple  $(\mathcal{U}, \phi)$  defined by:

- a set  $\mathcal{U} = \{u_0, u_1, \dots, u_m\}$  of **atoms**
- a **truth table**  $\phi$  such that  $\phi(p_i, u_{l_1}, \dots, u_{l_{k_i}})$  denotes the truth value of  $p_i$  for  $u_{l_1}, \dots, u_{l_{k_i}}$   
note: truth values are elements of the lattice  $\{0, \frac{1}{2}, 1\}$

We write  $\mathbb{D}_3^\sharp$  for the set of three-structures.



$$\begin{cases} \mathcal{U} = \{u_0, u_1\} \\ \mathcal{P} = \{x(\cdot), n(\cdot, \cdot), \underline{\text{sum}}(\cdot)\} \end{cases}$$

	x	<u>sum</u>	n	$u_0$	$u_1$
$u_0$	1	0	$u_0$	0	1
$u_1$	0	$\frac{1}{2}$	$u_1$	0	0

**In the following we build up an abstract domain of 3-structures (but a bit more work is need for the concretization)**

# Main predicates and concretization

We have already seen:

- $x(u)$ : variable  $x$  contains the address of  $u$
- $n(u, v)$ : field of  $u$  points to  $v$
- $\underline{\text{sum}}(u)$ : whether  $u$  is a summary node (convention: either 0 or  $\frac{1}{2}$ )
- $\underline{\text{sh}}(u)$ : whether there exists several distinct pointers to  $u$
- $\underline{\text{r}}(u, v)$ : whether  $v$  is reachable starting from  $u$
- $\underline{\text{acy}}(v)$ :  $v$  may not be on a cycle

## Concretization for 2 structures:

$$(e, h, \nu) \in \gamma_2(\mathcal{U}, \phi) \iff \bigwedge_{p \in \mathcal{P}} (\text{env}, h, \nu) \text{ evaluates } p \text{ as specified in } \phi$$

## Concretization for 3 structures:

- predicates with value  $\frac{1}{2}$  may concretize either to true or to false
- but the concretization of summary nodes is still unclear...

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# Embedding

Reasons why we need to set up a **relation among structures**:

- learn how to **compare** two 3-structures
- describe the **concretization** of 3-structures into 2-structures

## The embedding principle

Let  $\mathcal{S}_0 = (\mathcal{U}_0, \phi_0)$  and  $\mathcal{S}_1 = (\mathcal{U}_1, \phi_1)$  be two three structures, with the same sets of predicates  $\mathcal{P}$ . Let  $f : \mathcal{U}_0 \rightarrow \mathcal{U}_1$ , surjective.

We say that  $f$  **embeds**  $\mathcal{S}_0$  **into**  $\mathcal{S}_1$  iff

$$\text{for all predicate } p \in \mathcal{P} \text{ of arity } k, \quad \text{for all } u_{l_1}, \dots, u_{l_{k_i}} \in \mathcal{U}_0, \\ \phi_0(u_{l_1}, \dots, u_{l_{k_i}}) \sqsubseteq \phi_1(f(u_{l_1}), \dots, f(u_{l_{k_i}}))$$

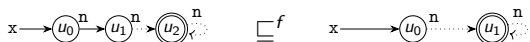
Then, **we write**  $\mathcal{S}_0 \sqsubseteq^f \mathcal{S}_1$

- Note: we use the order  $\sqsubseteq$  of the lattice  $\{0, \frac{1}{2}, 1\}$
- Intuition: **embedding** defines an **abstract pre-order**  
i.e., when  $\mathcal{S}_0 \sqsubseteq^f \mathcal{S}_1$ , any property that is satisfied by  $\mathcal{S}_0$  is also satisfied by  $\mathcal{S}_1$



# Embedding examples

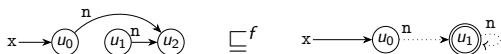
A few examples of the embedding relation:



where  $f : u_0 \mapsto u_0; u_1 \mapsto u_1; u_2 \mapsto u_1$



where  $f : u_0 \mapsto u_0; u_1 \mapsto u_1; u_2 \mapsto u_1; u_3 \mapsto u_1$



where  $f : u_0 \mapsto u_0; u_1 \mapsto u_1; u_2 \mapsto u_1$

The last example shows summary nodes are not enough to capture just lists:

- **reachability** would be necessary to constrain it be a list
- alternatively: list cells **should not be shared**

# Concretization of three-structures

## Intuitions:

- concrete memory states correspond to 2-structures
- embedding applies uniformly to 2-structures and 3-structures (in fact, 2-structures are a subset of 3-structures)
- 2-structures can be embedded into 3-structures, that abstract them

This suggests **a concretization of 3-structures in two steps:**

- 1 turn it into a set of 2-structures that can be embedded into it
- 2 concretize these 2-structures

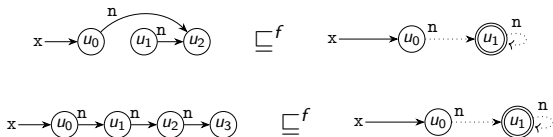
## Concretization of 3-structures

Let  $\mathcal{S}$  be a 3-structure. Then:

$$\gamma_3(\mathcal{S}) = \bigcup \{ \gamma_2(\mathcal{S}') \mid \mathcal{S}' \text{ 2-structure s.t. } \exists f, \mathcal{S}' \sqsubseteq^f \mathcal{S} \}$$

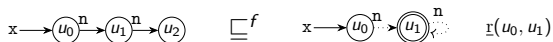
# Concretization examples

## Without reachability:



where  $f : u_0 \mapsto u_0; u_1 \mapsto u_1; u_2 \mapsto u_1; u_3 \mapsto u_1$

## With reachability:



where  $f : u_0 \mapsto u_0; u_1 \mapsto u_1; u_2 \mapsto u_1$

# Disjunctive completion

- Do 3-structures allow for a **sufficient level of precision** ?
- How to **over-approximate a set of 2-structures** ?

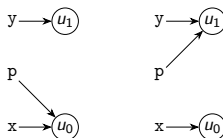
```

int * x; int * y; ...
int * p = NULL;
if(..){
  p = x;
}else{
  p = y;
}
printf("%d", *p);
*p = ...;

```

After the if statement:

abstracting would be imprecise



## Abstraction based on disjunctive completion

- In the following, we use **partial disjunctive completion** *i.e.*, TVLA manipulates **finite disjunctions** of 3-structures  
We write  $\mathbb{D}_{\mathcal{P}(3)}^{\#}$  for the abstract domain made of finite sets of 3-structures in  $\mathbb{D}_3^{\#}$
- How to ensure disjunctions **will not grow infinite** ?  
the set of atoms is **unbounded**, so it is not necessarily true!

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# Canonical abstraction

To **prevent disjunctions** from growing infinite, we propose to **normalize (in a precision losing manner)** abstract states:

- the analysis may use all 3-structures at most points
- at selected points (including loop heads), only 3-structures in a finite set  $\mathbb{D}_{\text{can}(3)}^\#$  are allowed
- there is a function to coarsen 3-structures into elements of  $\mathbb{D}_{\text{can}(3)}^\#$

## Canonicalization function

Let  $\mathcal{L}$  be a lattice,  $\mathcal{L}' \subseteq \mathcal{L}$  be a finite sub-lattice and  $\text{can} : \mathcal{L} \rightarrow \mathcal{L}'$ :

- operator **can** is called **canonicalization** if and only if it defines an **upper closure operator**
- then it extends into a **canonicalization operator**  $\text{can} : \mathcal{P}(\mathcal{L}) \rightarrow \mathcal{P}(\mathcal{L}')$  for the disjunctive completion domain:

$$\text{can}(\mathcal{E}) = \{\text{can}(x) \mid x \in \mathcal{E}\}$$

- proof of the extension two disjunctive completion domains: left as an exercise
- to make the powerset domain work, we simply need a **can** over 3-structures

# Canonical abstraction

## Definition of a finite lattice $\mathbb{D}_{\text{can}(3)}^\#$

We partition the set of predicates  $\mathcal{P}$  into two subsets  $\mathcal{P}_a$  and  $\mathcal{P}_o$ :

- $\mathcal{P}_a$  defines **abstraction predicates** and should contain only unary predicates and have a finite truth table whatever the number of atoms
- $\mathcal{P}_o$  denotes **non-abstraction predicates**, and may define truth tables of unbounded size

Then, we let  $\mathbb{D}_{\text{can}(3)}^\#$  be the set of 3-structures such that **no pair of atoms have the same value of the  $\mathcal{P}_a$  predicates**. It defines a finite set of 3-structures.

This sub-lattice defines a clear “canonicalization” algorithm:

## Canonical abstraction by truth blurring

- 1 **Identify** nodes that **have different abstraction predicates**
- 2 When several nodes have the **same abstraction predicate** **introduce a summary node**
- 3 **Compute new predicate values** by doing a **join over truth values**

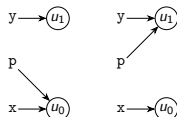
# Canonical abstraction examples

Most common TVLA instantiation:

- we assume there are  $n$  variables  $x_1, \dots, x_n$   
**thus the number of unary predicates is finite**, and provides a good choice for  $\mathcal{P}_a$
- **sub-lattice**: structures with atoms **distinguished by the values of the unary predicates**  $x_1, \dots, x_n$

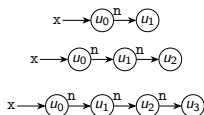
Examples:

Elements not merged:

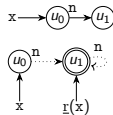


Elements merged:

Lists of lengths 1, 2, 3:



Abstract into:





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# Principle for the design of sound transfer functions

- Intuitively, **concrete states** correspond to **2-structures**
- The **analysis** should track **3-structures**, thus the analysis and its soundness proof need to **rely on the embedding relation**

## Embedding theorem

We assume that

- $\mathcal{S}_0 = (\mathcal{U}_0, \phi_0)$  and  $\mathcal{S}_1 = (\mathcal{U}_1, \phi_1)$  define a pair of 3-structures
- $f : \mathcal{U}_0 \rightarrow \mathcal{U}_1$ , is such that  $\mathcal{S}_0 \sqsubseteq^f \mathcal{S}_1$  (embedding)
- $\Psi$  is a logical formula, with variables in  $X$
- $g : X \rightarrow \mathcal{U}_0$  is an assignment for the variables of  $\Psi$

Then, the semantics (evaluation) of logical formulae is such that

$$\llbracket \Psi \rrbracket_{|g}(\mathcal{S}_0) \sqsubseteq \llbracket \Psi \rrbracket_{|f \circ g}(\mathcal{S}_1)$$

**Intuition:** this theorem ties the evaluation of conditions in the concrete and in the abstract in a general manner

# Principle for the design of sound transfer functions

## Transfer functions for static analysis

- **Semantics of concrete statements is encoded into boolean formulas**
- **Evaluation in the abstract is sound (embedding theorem)**

**Example:** analysis of an assignment  $y := x$

- 1 let  $y'$  be a new predicate that denotes the *new* value of  $y$
- 2 then we can add the constraint  $y'(u) = x(u)$   
(using the embedding theorem to prove soundness)
- 3 rename  $y'$  into  $y$

### Advantages:

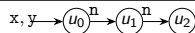
- **abstract transfer functions** derive directly from the concrete transfer functions (**intuition:**  $\alpha \circ f \circ \gamma \dots$ )
- the same solution works for **weakest pre-conditions**

**Disadvantage:** precision will require some care, more on this later!

## Assignment: a simple case

**Statement**  $l_0 : y = y \rightarrow n; l_1 : \dots$

**Pre-condition**  $\mathcal{S}$

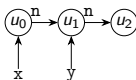


### Transfer function computation:

- it should produce an over-approximation of  $\{m_1 \in \mathbb{M} \mid (l_0, m_0) \rightarrow (l_1, m_1)\}$
- encoding** using “**primed predicates**” to denote predicates **after** the evaluation of the assignment, to evaluate them in the same structure (non primed variables are removed afterwards and primed variables renamed):

$$\begin{aligned} x'(u) &= x(u) \\ y'(u) &= \exists v, y(v) \wedge n(v, u) \\ n'(u, v) &= n(u, v) \end{aligned}$$

- resulting structure:**



This is exactly the expected result

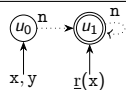
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## Assignment: a more involved case

**Statement**  $l_0 : y = y \rightarrow n; l_1 : \dots$

**Pre-condition**  $\mathcal{S}$



- Let us try to **resolve the update in the same way as before**:

$$\begin{aligned} x'(u) &= x(u) \\ y'(u) &= \exists v, y(v) \wedge n(v, u) \\ n'(u, v) &= n(u, v) \end{aligned}$$

- We **cannot resolve  $y'$** :

$$\begin{cases} y'(u_0) &= 0 \\ y'(u_1) &= \frac{1}{2} \end{cases}$$

**Imprecision**: after the statement,  $y$  may point to anywhere in the list, save for the first element...

- The assignment transfer function **cannot be computed immediately**
- We need to refine the 3-structure first**

## Focus

## Focusing on a formula

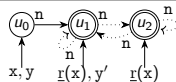
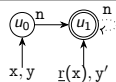
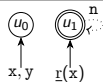
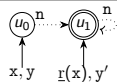
We assume a 3-structure  $\mathcal{S}$  and a boolean formula  $f$  are given, we call a **focusing**  $\mathcal{S}$  on  $f$  the generation of a set  $\hat{\mathcal{S}}$  of 3-structures such that:

- $f$  evaluates to 0 or 1 on all elements of  $\hat{\mathcal{S}}$
- **precision was gained:**  $\forall S' \in \hat{\mathcal{S}}, S' \sqsubseteq \mathcal{S}$  (embedding)
- **soundness is preserved:**  $\gamma(\mathcal{S}) = \bigcup \{ \gamma(S') \mid S' \in \hat{\mathcal{S}} \}$

- Details of focusing algorithms are rather complex: not detailed here
- They involve splitting of summary nodes, solving of boolean constraints

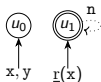
**Example:** focusing on  
 $y'(u) = \exists v, y(v)$   
 $\wedge n(v, u)$

**We obtain** (we show  $y$  and  $y'$ ):

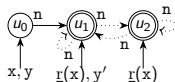


## Focus and coerce

Some of the 3-structures generated by focus are not precise



$u_1$  is reachable from  $x$ , but there is no sequence of  $n$  fields: this structure has **empty concretization**

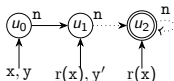
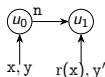


$u_0$  has an  $n$ -field to  $u_1$  so  $u_1$  denotes a unique atom and **cannot be a summary node**

## Coerce operation

It **enforces logical constraints** among predicates and discards 3-structures with an empty concretization

**Result:** one case removed (bottom), two possibly summary nodes non summary

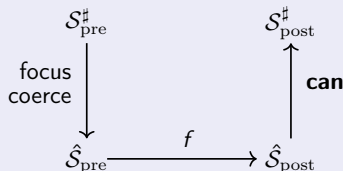




## Focus, transfer, abstract...

## Computation of a transfer function

We consider a transfer function encoded into boolean formula  $f$



**Soundness proof** steps:

- ① **sound encoding of the semantics of program statements into formulas** (typically, no loss of precision at this stage)
- ② **focusing** produces a **refined** over-approximation (disjunction)
- ③ **canonicalization over-approximates graphs** (truth blurring)

**A common picture in shape analysis**

# Shape analysis with three valued logic

**Abstract states; two abstract domains** are used:

- **infinite domain**  $\mathbb{D}_{\mathcal{P}(3)}^\sharp$ : finite disjunctions of 3-structures in  $\mathbb{D}_3^\sharp$  for general abstract computations
- **finite domain**  $\mathbb{D}_{\mathcal{P}(\text{can}(3))}^\sharp$ : disjunctions of finite domain  $\mathbb{D}_{\text{can}(3)}^\sharp$  to simplify abstract states and for loop iteration
- **concretization** via  $\mathbb{D}_2^\sharp$

**Abstract post-conditions:**

- 1 start from  $\mathbb{D}_{\mathcal{P}(3)}^\sharp$  or  $\mathbb{D}_{\text{can}(3)}^\sharp$
- 2 focus and coerce when needed
- 3 apply the concrete transformation
- 4 apply **can** to weaken abstract states; result in  $\mathbb{D}_{\mathcal{P}(\text{can}(3))}^\sharp$

**Analysis of loops:**

- iterations in  $\mathbb{D}_{\mathcal{P}(\text{can}(3))}^\sharp$  terminate, as it is finite

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# Separation logic

## Separation logic formulas (main connectors only)

$$\begin{array}{l}
 \mathbf{F} ::= \mathbf{emp} \\
 \quad | \quad \mathbf{TRUE} \\
 \quad | \quad l \mapsto l \\
 \quad | \quad \mathbf{F}_0 * \mathbf{F}_1 \\
 \quad | \quad \mathbf{F}_0 \wedge \mathbf{F}_1 \\
 \quad | \quad \mathbf{F}_0 \text{---} * \mathbf{F}_1
 \end{array}$$

### Concretization:

$$\begin{aligned}
 \gamma(\mathbf{emp}) &= \mathbb{E} \times \{\emptyset\} \\
 \gamma(\mathbf{TRUE}) &= \mathbb{E} \times \mathbb{H} \\
 \gamma(l \mapsto v) &= \{(e, \llbracket l \rrbracket(e, h) \mapsto v) \mid e \in \mathbb{E}\} \\
 \gamma(\mathbf{F}_0 * \mathbf{F}_1) &= \{(e, h_0 \otimes h_1) \mid (e, h_0) \in \gamma(\mathbf{F}_0) \wedge (e, h_1) \in \gamma(\mathbf{F}_1)\} \\
 \gamma(\mathbf{F}_0 \wedge \mathbf{F}_1) &= \gamma(\mathbf{F}_0) \cap \gamma(\mathbf{F}_1) \\
 \gamma(\mathbf{F}_0 \text{---} * \mathbf{F}_1) &= \text{exercise}
 \end{aligned}$$

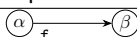
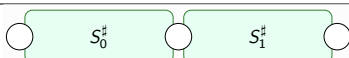
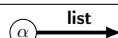
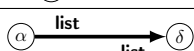
### Program reasoning: **frame rule** and **strong updates**

# 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 $S^\# \in \mathbb{D}_{sh}^\#$	Translated formula $\Pi(S^\#)$
	$\alpha \cdot f \mapsto \beta$
	$\Pi(S_0^\#) * \Pi(S_1^\#)$
	$\alpha \cdot \text{list}$
	$\alpha \cdot \text{list\_endp}(\delta)$
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:

$$F_0 * F_1 * \dots * F_n$$

- first the heap is partitioned
- each region is described separately
- some of the  $F_i$  components may be summary predicates, describing unbounded regions
- reachability is implicit
- allows local reasoning

## Three valued logic:

$$p_0 \wedge p_1 \wedge \dots \wedge p_n$$

- first a conjunction of properties
- each predicate  $p_i$  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

## Summarization: one abstract cell, many concrete cells

**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

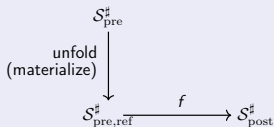
# Concretize partially, update, abstract

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

Separation logic:

Local (partial) concretization

For **materialization**:

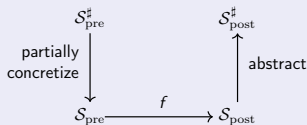


In both cases, two mechanisms are needed:

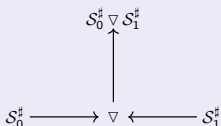
- 1 refine summaries
- 2 synthesize summaries

TVLA:

Focus, analyze, canonicalize



Global abstraction: widening





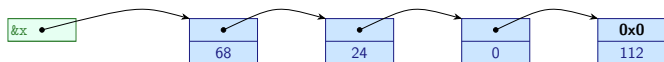
# Outline

- 1 Introduction
- 2 Setup (reminder)
- 3 Shape analysis in Three-Valued Logic (TVL)
- 4 Combining shape and value abstractions**
  - Shape and value properties
  - Combined abstraction with cofibered abstract domain
  - Combined analysis algorithms
- 5 Conclusion

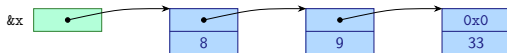
# Shape and value properties

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:**



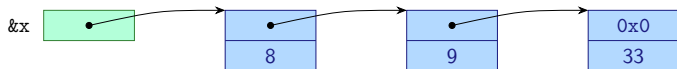
- **list with a length constraint**
- **tries:** binary trees with paths labelled with sequences of “0” and “1”
- **balanced trees:** red-black, AVL...

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

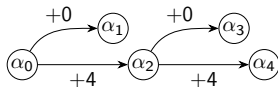
$$\alpha \cdot \mathbf{lsort}_{\text{aux}}(n) := \begin{array}{l} \alpha = 0 \wedge \mathbf{emp} \\ \vee \alpha \neq 0 \wedge n \leq \beta \wedge \alpha \cdot \mathbf{next} \mapsto \delta \\ * \alpha \cdot \mathbf{data} \mapsto \beta * \delta \cdot \mathbf{lsort}_{\text{aux}}(\beta) \end{array}$$

$$\alpha \cdot \mathbf{lsort}() := \alpha \cdot \mathbf{lsort}_{\text{aux}}(-\infty)$$

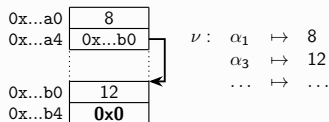
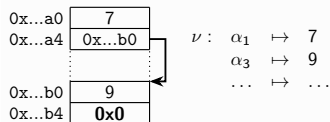
## Adding value information (here, numeric)

**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**  $\mathbb{D}_{\text{sh}}^{\#}$  of graphs  
 abstract stores together with a **physical mapping** of nodes  

$$\gamma_{\text{sh}} : \mathbb{D}_{\text{sh}}^{\#} \rightarrow \mathcal{P}((\mathbb{D}_{\text{sh}}^{\#} \rightarrow \mathbb{M}) \times (\mathbb{V}^{\#} \rightarrow \mathbb{V}))$$
- **numerical abstract domain**  $\mathbb{D}_{\text{num}}^{\#}$ , abstracts physical mapping of nodes  

$$\gamma_{\text{num}} : \mathbb{D}_{\text{num}}^{\#} \rightarrow \mathcal{P}(\mathbb{V}^{\#} \rightarrow \mathbb{V})$$

## Combined domain [CR]

- **Set of abstract values:**  $\mathbb{D}^{\#} = \mathbb{D}_{\text{sh}}^{\#} \times \mathbb{D}_{\text{num}}^{\#}$
- **Concretization:**

$$\gamma(S^{\#}, N^{\#}) = \{(h, \nu) \in \mathbb{M} \mid \nu \in \gamma_{\text{num}}(N^{\#}) \wedge (h, \nu) \in \gamma_{\text{sh}}(S^{\#})\}$$

## Can it be described as a reduced product ?

- **product abstraction:**  $\mathbb{D}^{\#} = \mathbb{D}_0^{\#} \times \mathbb{D}_1^{\#}$  (componentwise ordering)
- **concretization:**  $\gamma(x_0, x_1) = \gamma(x_0) \cap \gamma(x_1)$
- **reduction:**  $\mathbb{D}_r^{\#}$  is the quotient of  $\mathbb{D}^{\#}$  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:



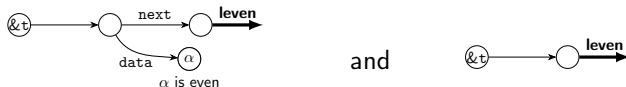
$$\alpha_1 \leq \alpha_2$$

$$\alpha_2 \leq \alpha_1 + \alpha_3$$

- 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**  $\mathbb{D}_{\text{sh}}^{\#}$
- For **each** graph  $S^{\#} \in \mathbb{D}_{\text{sh}}^{\#}$ , we have a **numerical lattice**  $\mathbb{D}_{\text{num}\langle S^{\#} \rangle}^{\#}$ 
  - ▶ example: if graph  $S^{\#}$  contains nodes  $\alpha_0, \alpha_1, \alpha_2$ ,  $\mathbb{D}_{\text{num}\langle S^{\#} \rangle}^{\#}$  should abstract  $\{\alpha_0, \alpha_1, \alpha_2\} \rightarrow \mathbb{V}$
- **An abstract value is a pair**  $(S^{\#}, N^{\#})$ , such that  $N^{\#} \in \mathbb{D}_{\text{num}\langle N^{\#} \rangle}^{\#}$

# Outline

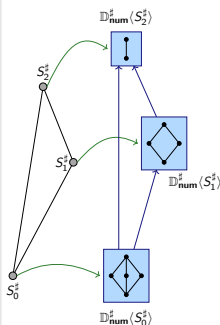
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# Cofibered domain

## Definition, for shape + num

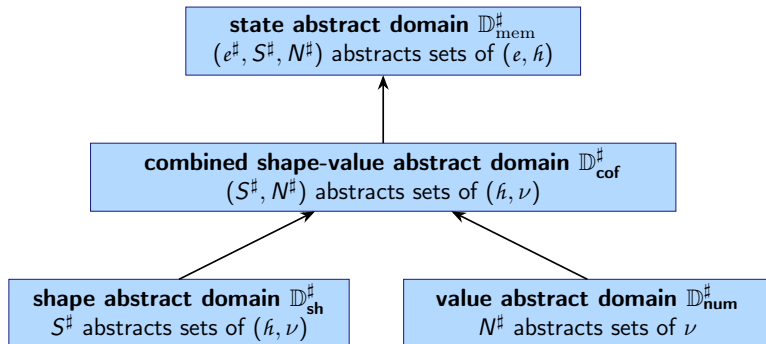
- Basis:** abstract domain  $(\mathbb{D}_{\text{sh}}^{\#}, \sqsubseteq^{\#})$ , with concretization  $\gamma_{\text{sh}} : \mathbb{D}_{\text{sh}}^{\#} \rightarrow \mathbb{D}$
- Function:**  $\phi : \mathbb{D}_{\text{sh}}^{\#} \rightarrow \mathcal{D}$ , where each element of  $\mathcal{D}$  is an abstract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

# 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 $(S_0^\#, N_0^\#)$ and $(S_1^\#, N_1^\#)$

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

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

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

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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

- 1 compute the post in the shape abstract domain and update the basis
- 2 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:

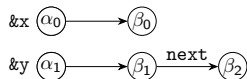
- the soundness of the lift functions
- the soundness of both domain transfer functions

# Analysis of an assignment in the graph domain

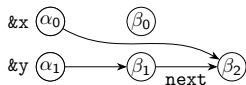
## Steps for analyzing $x = y \rightarrow \text{next}$ (local reasoning)

- 1 Evaluate **l-value**  $x$  into **points-to edge**  $\alpha \mapsto \beta$
- 2 Evaluate **r-value**  $y \rightarrow \text{next}$  into **node**  $\beta'$
- 3 Replace points-to edge  $\alpha \mapsto \beta$  with **points-to edge**  $\alpha \mapsto \beta'$

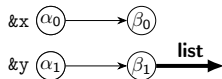
### With pre-condition:



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

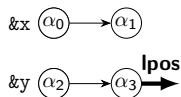
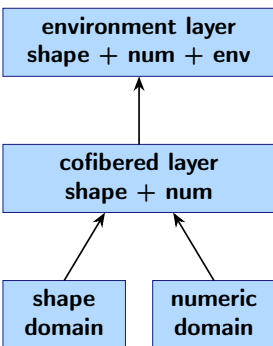


### With pre-condition:



- Step 1 produces  $\alpha_0 \mapsto \beta_0$
- **Step 2 can succeed only after unfolding is performed**

## Analysis of an assignment in the combined domain

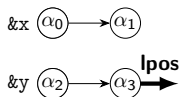
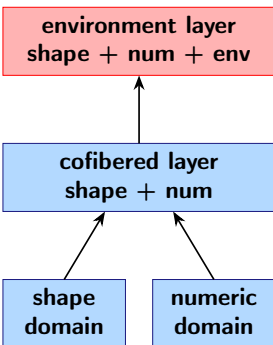


$$N^\# = \alpha_1 \geq 0 \wedge \alpha_3 \neq \mathbf{0x0}$$

$y \rightarrow d = x + 1$

Abstract post-condition ?

## Analysis of an assignment in the combined domain



$$N^\# = \alpha_1 \geq 0 \wedge \alpha_3 \neq 0x0$$

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

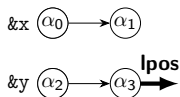
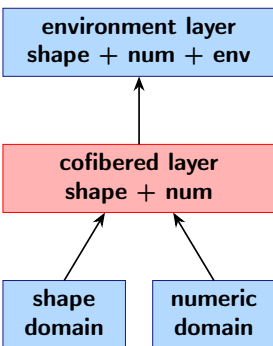
**Abstract post-condition ?**

### Stage 1: environment resolution

- replaces  $x$  with  $*e^\#(x)$



## Analysis of an assignment in the combined domain



$$N^\# = \alpha_1 \geq 0 \wedge \alpha_3 \neq \mathbf{0x0}$$

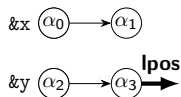
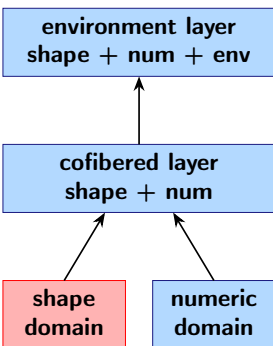
$$(*\alpha_2) \cdot \mathbf{d} = (*\alpha_0) + 1$$

**Abstract post-condition ?**

**Stage 2: propagate into the shape + numerics domain**

- only symbolic nodes appear

## Analysis of an assignment in the combined domain



$$N^\# = \alpha_1 \geq 0 \wedge \alpha_3 \neq \mathbf{0x0}$$

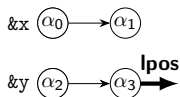
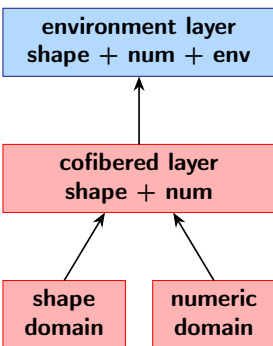
$$(*\alpha_2) \cdot \mathbf{d} = (*\alpha_0) + 1$$

Abstract post-condition ?

Stage 3: resolve cells in the shape graph abstract domain

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

## Analysis of an assignment in the combined domain



$$N^\# = \alpha_1 \geq 0 \wedge \alpha_3 \neq \mathbf{0x0}$$

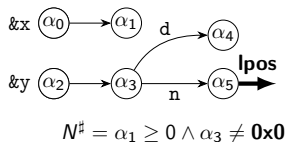
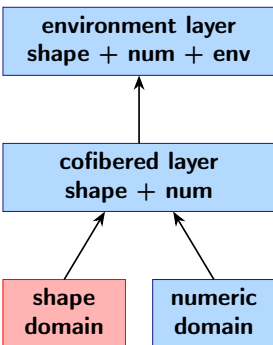
$$(*\alpha_2) \cdot \mathbf{d} = (*\alpha_0) + 1$$

**Abstract post-condition ?**

### Stage 4 (a): unfolding triggered

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

## Analysis of an assignment in the combined domain



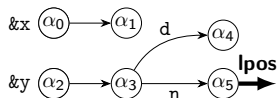
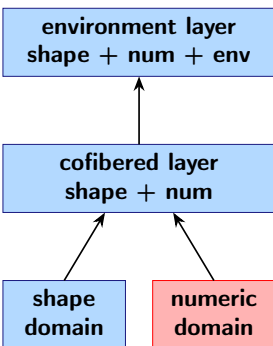
$$(*\alpha_2) \cdot d = (*\alpha_0) + 1$$

**Abstract post-condition ?**

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

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

## Analysis of an assignment in the combined domain



$$N^\# = \alpha_1 \geq 0 \wedge \alpha_3 \neq \mathbf{0x0} \wedge \alpha_4 \geq 0$$

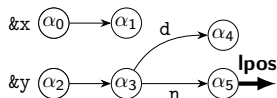
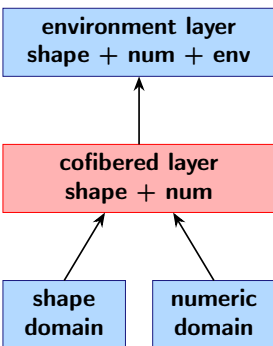
$$(*\alpha_2) \cdot d = (*\alpha_0) + 1$$

Abstract post-condition ?

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

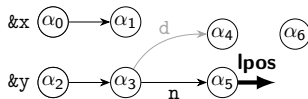
- numerical predicates taken into account
- l-value  $\alpha_3 \cdot d$  **now evaluates into edge**  $\alpha_3 \cdot d \mapsto \alpha_4$

## Analysis of an assignment in the combined domain



$$N^\# = \alpha_1 \geq 0 \wedge \alpha_3 \neq \mathbf{0x0} \wedge \alpha_4 \geq 0$$

create node  $\alpha_6$

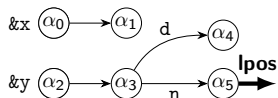
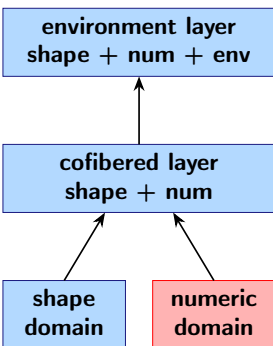


$$N^\# = \alpha_1 \geq 0 \wedge \alpha_3 \neq \mathbf{0x0} \wedge \alpha_4 \geq 0$$

## Stage 5: create a new node

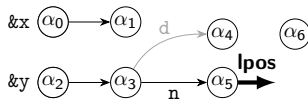
- new node  $\alpha_6$  denotes a new value  
will store the new value

## Analysis of an assignment in the combined domain



$$N^\# = \alpha_1 \geq 0 \wedge \alpha_3 \neq \mathbf{0x0} \wedge \alpha_4 \geq 0$$

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

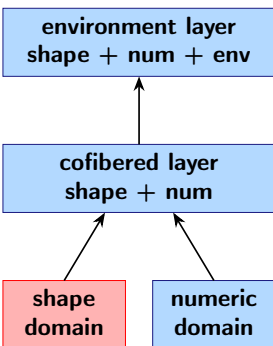


$$N^\# = \alpha_1 \geq 0 \wedge \alpha_3 \neq \mathbf{0x0} \wedge \alpha_4 \geq 0 \wedge \alpha_6 \geq 1$$

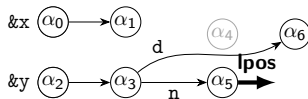
## Stage 6: perform numeric assignment

- numeric assignment **completely ignores pointer structures** to the new node

## Analysis of an assignment in the combined domain



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



$$N^\# = \alpha_1 \geq 0 \wedge \alpha_3 \neq \mathbf{0x0} \wedge \alpha_4 \geq 0 \wedge \alpha_6 \geq 1$$

## 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



# Shape graph weakening: definition (reminder)

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

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

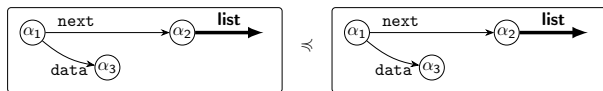
We then note  $S_0^\sharp \preceq S_1^\sharp$

## Applications:

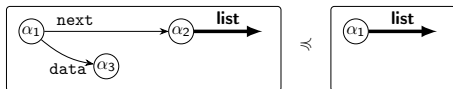
- **inclusion test** (comparison) inputs  $S_0^\sharp, S_1^\sharp$ ; if returns true  $S_0^\sharp \preceq S_1^\sharp$
- **canonicalization** (unary weakening) inputs  $S_0^\sharp$  and returns  $\rho(S_0^\sharp)$  such that  $S_0^\sharp \preceq \rho(S_0^\sharp)$
- **widening / join** (binary weakening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

# Shape graph weakening weakening based on local rules (reminder)

By **rule** ( $\approx_{\text{id}}$ ):



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



Additionally, by **rule** ( $\approx_{\text{id}}$ ):



Thus, by **rule** ( $\approx_*$ ):



# Shape graph abstract 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  $\forall i \in \{0, 1\}, \forall s \in \{\text{left}, \text{right}\}, S_{i,s}^\sharp \preceq S_s^\sharp$ ,

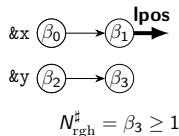
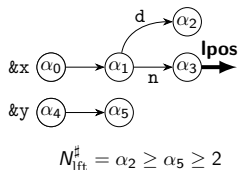
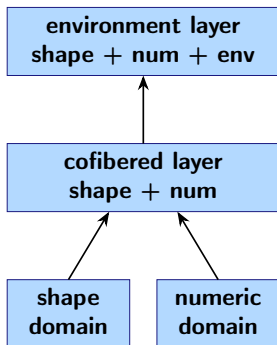


The partitioning of inputs / different nodes sets requires a **node correspondence function**

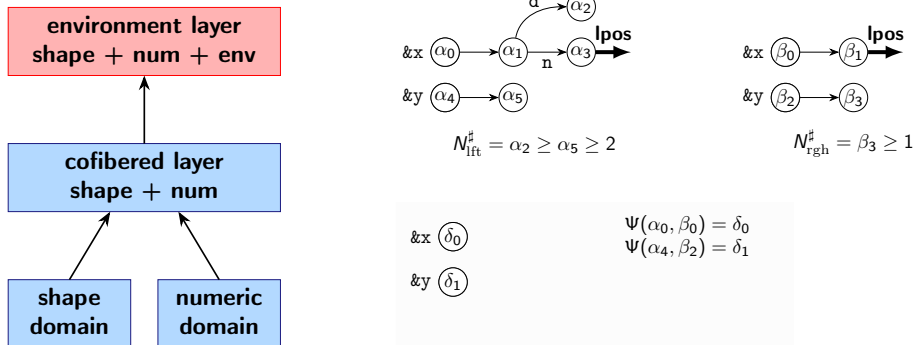
$$\Psi : \mathbb{V}^\sharp(S_{\text{left}}^\sharp) \times \mathbb{V}^\sharp(S_{\text{right}}^\sharp) \longrightarrow \mathbb{V}^\sharp(S^\sharp)$$

- 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**

## Widening / join in the combined domain



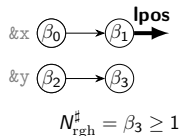
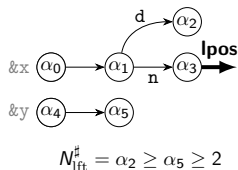
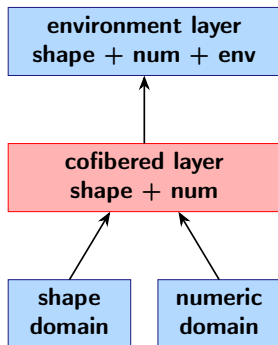
## Widening / join in the combined domain



## Stage 1: abstract environment

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

## Widening / join in the combined domain

 $\&x \ \delta_0$  $\&y \ \delta_1$ 

$$\Psi(\alpha_0, \beta_0) = \delta_0$$

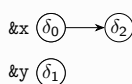
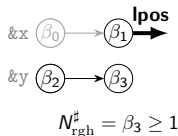
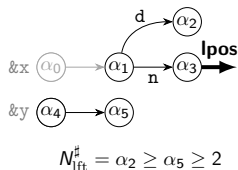
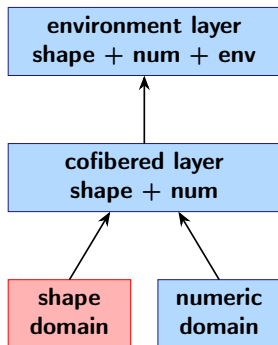
$$\Psi(\alpha_4, \beta_2) = \delta_1$$

## Stage 2: join in the “cofibered” layer

operations to perform:

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

## Widening / join in the combined domain



$$\Psi(\alpha_0, \beta_0) = \delta_0$$

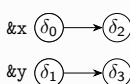
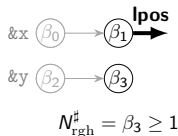
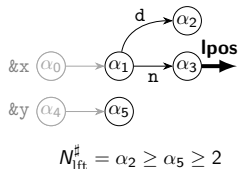
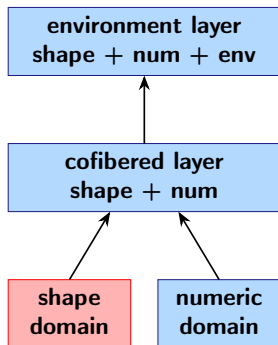
$$\Psi(\alpha_4, \beta_2) = \delta_1$$

$$\Psi(\alpha_1, \beta_1) = \delta_2$$

## Stage 2: graph join

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

## Widening / join in the combined domain



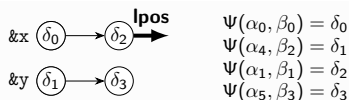
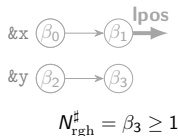
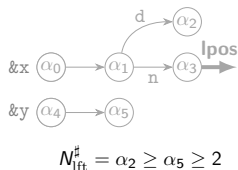
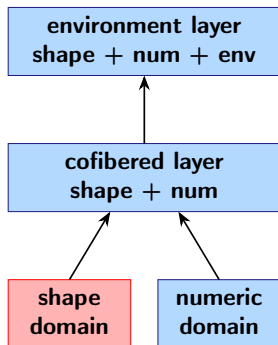
$$\begin{aligned} \Psi(\alpha_0, \beta_0) &= \delta_0 \\ \Psi(\alpha_4, \beta_2) &= \delta_1 \\ \Psi(\alpha_1, \beta_1) &= \delta_2 \\ \Psi(\alpha_5, \beta_3) &= \delta_3 \end{aligned}$$

## Stage 2: graph join

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



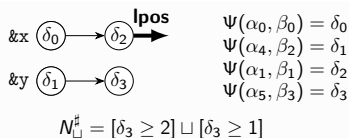
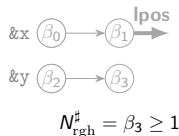
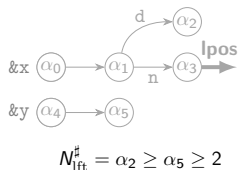
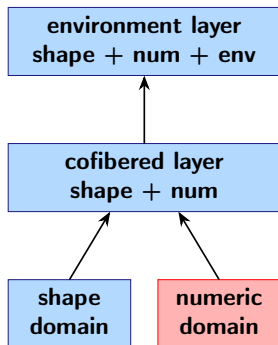
## Widening / join in the combined domain



## Stage 2: graph join

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

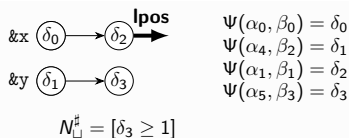
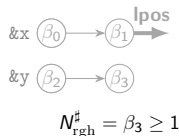
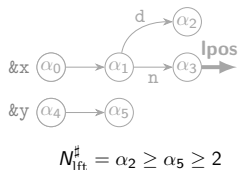
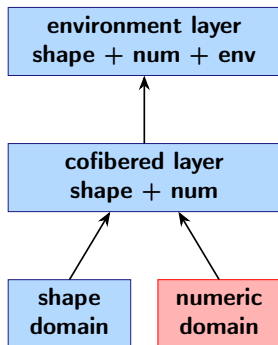
## Widening / join in the combined domain



## Stage 3: conversion function application in numerics

- remove nodes that were abstracted away
- rename other nodes

## Widening / join in the combined domain



## Stage 4: join in the numeric domain

- apply  $\sqcup$  for regular join,  $\nabla$  for a widening

# Outline

- 1 Introduction
- 2 Setup (reminder)
- 3 Shape analysis in Three-Valued Logic (TVL)
- 4 Combining shape and value abstractions
- 5 Conclusion**

# Shape analysis and summarization

## Summaries:

- describe **unbounded** memory regions, with general predicates e.g., list or tree structures, local and global sharing (doubly-linked lists)
- **summary nodes** + associated predicates in TVLA, **inductive predicates** in separation logic

## Local refinement (concretization):

- **focus** in TVLA, **unfolding** in separation logic based analysis
- required to **analyze precisely post-conditions** that touch summaries

## Global abstraction:

- **ensure termination** despite unbounded, infinite domain
- in TVLA, **canonical abstraction** into a finite domain

In all cases, analysis algorithms aim at avoiding **weak updates** (that would cause a severe precision loss over the whole memory)

# Shape analysis and value abstraction

**Main issue:** the support of the shape abstraction is **always changing**

- summaries appear at canonicalization/widening points
- new atoms/nodes appear at focus/materialization points

## Cofibered domain

**an abstract form of dependent product**

**assymmetric version of  $\mathbb{D}_{\text{sh}}^{\#} \times \mathbb{D}_{\text{num}}^{\#}$**

- the shape abstraction “controls” the value abstraction
- information can still be exchanged in both directions (reduction)
- slightly more complex lattice structure  
but standard definitions for widening, inclusion test...

# Bibliography

- **[SRW]: Parametric Shape Analysis via 3-Valued Logic.**  
**Shmuel Sagiv, Thomas W. Reps et Reinhard Wilhelm.** In POPL'99, pages 105–118, 1999.
- **[AV]: Abstract Cofibered Domains: Application to the Alias Analysis of Untyped Programs.**  
**Arnaud Venet.**  
In SAS'96, pages 366–382.
- **[CR]: Relational inductive shape analysis.**  
**Bor-Yuh Evan Chang et Xavier Rival.**  
In POPL'08, pages 247–260, 2008.

# Assignment: formalization and paper reading

## Formalization of the concretization of 2-structures:

- describe the concretization formula, assuming that we consider the predicates discussed in the course
- run it on the list abstraction example (from the 3-structure to a few select 2-structures, and down to memory states)
- prove the correctness and termination of the widening of the cofibered abstract domain

## Reading:

### Parametric Shape Analysis via 3-Valued Logic.

Shmuel Sagiv, Thomas W. Reps et Reinhard Wilhelm.

In POPL'99, pages 105–118, 1999.