

# Data abstraction, arrays, maps, and completeness, aka “Cell morphing”

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# Arrays and maps

Array of elements of  $D$ : map from  $\mathbb{Z}$  to  $D$  (implement bound check independently)

More generally: maps from  $I$  to  $D$ , for any  $I$

Occurs:

- ▶ arrays
- ▶ array-like data structures (hash tables...)
- ▶ memory seen as an array of bytes
- ▶ structure field seen as an array indexed by the object
- ▶ array of processes, local variables in process indexed by process id
- ▶ participants in a protocol (indexed by participant id)

# More arrays and maps

Set of elements from  $S$ : map from  $S$  to  $\{0, 1\}$

Multiset of elements from  $S$ : map from  $S$  to  $\mathbb{N}$

Relation between elements of  $A$  and  $B$ : map from  $A \times B$  to  $\{0, 1\}$

Can talk of contents of data structures (multiset of elements in an array, etc.)

Can talk of “who points where”

# Invariants on single arrays

Often of the universal form

- ▶  $\forall k, P(i, j, \dots, k, t[k])$  e.g.  $\forall k, 0 \leq k < n \implies t[k] \geq 0$
- ▶  $\forall k_1 k_2, P(i, j, \dots, k_1, k_2, t[k_1], t[k_2])$  e.g.  $\forall k, 0 \leq k_1 \leq k_2 < n \implies t[k_1] \leq t[k_2]$

“At all positions (or pairs of positions) in the array, a certain relationship holds between the elements at these positions, these positions, and the rest of the program variables”

# Other properties

## Neighbors

$$\forall k, P(k, t[k-1], t[k], t[k+1])$$

## Multidimensional arrays

$$\forall i, j P(i, j, t[i, j])$$

$$\text{Index set} = \mathbb{Z}^2$$

# Invariants on multiple arrays

Such as

- ▶  $\forall k, P(i, j, \dots, k, t_1[k], t_2[k])$  e.g.  $\forall k, 0 \leq k < n \implies t_1[k] = t_2[k]$
- ▶  $\forall k, P(i, j, \dots, k_1, k_2, t_1[k_1], t_2[k_2])$  e.g.  
 $\forall k, 0 \leq k < n \wedge k_2 = n - k_1 \implies t_1[k_1] = t_2[k_2]$

Or “the multiset of elements in  $t_1$  is the same as in  $t_2$ ”

# Horn clauses

```
int a[N];  
for(int i=0; i<N; i++) {  
    t[i] = 42;  
}
```

Loop initialization  $\forall N, a, L(N, a, 0)$

Loop exit  $\forall N, a, i, L(N, a, i) \wedge i \geq N \implies E(N, a)$

Loop execution  $\forall N, a, i, L(N, a, i) \wedge i < N \implies L(N, a[i \mapsto 42], i + 1)$

we may wish to prove  $\forall N, a, i, E(N, a) \wedge 0 \leq i < N \implies a[i] = 42$

# Une seule solution : la bonne abstraction !

abstract interpretation = look for solutions within an abstract domain

abstract domain = restrict the shape of invariants

e.g. “look for an invariant on tuples of integer variables in products of intervals”

Thus “look for invariants of the form  $\forall k, P(i, j, \dots, k, t_1[k], t_2[k])$ ” is abstract interpretation

abstract domain =  $\{\{i, j, t_1, t_2 \mid \forall k, P(i, j, k, t_1[k], t_2[k])\} \mid P \subseteq \mathbb{Z} \times \mathbb{Z} \times D \times D\}$



# The Galois connection

For  $P^\sharp \subseteq \mathbb{Z} \times \mathbb{Z} \times \mathbb{Z} \times D$ ,  $\gamma(P^\sharp) \subseteq: \mathbb{Z} \times \mathbb{Z} \times (\mathbb{Z} \rightarrow D)$

$$\gamma(P^\sharp)(N, i, a) \equiv \forall k, P^\sharp(N, i, k, a[k])$$

Of course  $\alpha(P) = \bigwedge_{P^\sharp | P \subseteq \gamma(P^\sharp)} P^\sharp$

# Our goal

Implement abstraction by syntactic transformation from Horn clause to Horn clauses.

# Substituted Horn clauses

```
int a[N];  
for(int i=0; i<N; i++) {  
    t[i] = 42;  
}
```

**Loop initialization**  $\forall N, a (\forall k L^\sharp(N, 0, k, a[k]))$

**Loop exit**  $\forall N, a, i (\forall k, L^\sharp(N, i, k, a[k])) \wedge i \geq N \implies (\forall k, E^\sharp(N, k, a[k]))$

**Loop execution**  $\forall N, a, i, (\forall k, L^\sharp(N, i, k, a[k])) \wedge i < N \implies$   
 $(\forall k, L^\sharp(N, i + 1, k, a[i \mapsto 42][k]))$

we may wish to prove  $\forall N, a, i, (\forall k, E^\sharp(N, k, a[k])) \wedge 0 \leq i < N \implies a[i] = 42$

# Quantifiers on the right hand side are easy

**Loop initialization**  $\forall N, k, a_k L^\sharp(N, 0, k, a_k)$

**Loop exit**  $\forall N, a, i, k (\forall K, L^\sharp(N, i, K, a[K])) \wedge i \geq N \implies E^\sharp(N, k, a[k])$

**Loop execution**

$\forall N, a, i, k (\forall K, L^\sharp(N, i, K, a[K])) \wedge i < N \implies L^\sharp(N, i + 1, k, a[i \mapsto 42])[k]$

Note: we still have quantifiers on the left.

# Instantiating the quantifiers on the left hand side

**Loop initialization**  $\forall N, k, a_k L^\sharp(N, 0, k, a_k)$

**Loop exit**  $\forall N, a, i, k L^\sharp(N, i, k, a[k]) \wedge i \geq N \implies E^\sharp(N, k, a[k])$

**Loop execution**  $\forall N, a, i, k L^\sharp(N, i, k, a[k]) \wedge i < N \implies L^\sharp(N, i + 1, k, a[i \mapsto 42])[k]$

Note: this is sound but could it be incomplete?

$P(k_1, x) \wedge P(k_2, x) \implies Q(x)$

implies

$(\forall k P(k, x)) \implies Q(x)$

# Further processing

One can even get rid of arrays by “Ackermannization”

**Loop initialization**  $\forall N, k, a_k L^\sharp(N, 0, k, a_k)$

**Loop exit**  $\forall N, i, k, a_k L^\sharp(N, i, k, a_k) \wedge i \geq N \implies E^\sharp(N, k, a_k)$

**Loop execution**  $\forall N, a, i, k, a_k L^\sharp(N, i, k, a_k) \wedge i < N \wedge k \neq i \implies L^\sharp(N, i + 1, k, a_k)$   
 $\forall N, a, i, a_i L^\sharp(N, i, i, a_i) \wedge i < N \implies L^\sharp(N, i + 1, i, 42)$

Note: now purely scalar problem, ready for Horn solvers!

# Instantiation strategy

Collect all indices  $i$  such that  $a[i]$  appears.  
Use all of them for instantiating.

Is this complete? (= is the resulting system equivalent to the original?)

# A simple example (I)

Two properties defining singletons:

$P(a)$  is true iff  $\forall k, a[k] = 0$

$Q(a)$  is true iff  $\forall k \neq 1, a[k] = 0 \wedge a[1] = 1$

In other words:

$P^\sharp(k, x) \equiv (x = 0)$

$Q^\sharp(k, x) \equiv (x = 0 \wedge k \neq 1) \vee (x = 1 \wedge k = 1)$

$P = \gamma(P^\sharp), Q = \gamma(Q^\sharp), P^\sharp = \alpha(P), Q^\sharp = \alpha(Q).$



## A simple example (II)

### Not abstracted

A Horn clause

$$\forall a, P(a) \wedge Q(a) \implies R(a[0])$$

(Obviously the left hand side is false, so the least solution for  $R$  is false. Thus some solutions can satisfy  $\forall x, \neg R(x)$ .)

### Abstracted

$$\forall a, (\forall k, P^\#(k, a[k])) \wedge (\forall k, Q^\#(k, a[k])) \implies R(a[0])$$

(So far so good, the left hand side is false.)

## A simple example (III)

### Instantiated

$$\forall a, P^\sharp(0, a[0]) \wedge Q^\sharp(0, a[0]) \implies R(a[0])$$

### Ackermannized

$$\forall a_0, P^\sharp(0, a_0) \wedge Q^\sharp(0, a_0) \implies R(a_0)$$

(The left hand side is obviously true for  $a_0 = 0$ . Thus no solution can satisfy  $\forall x, \neg R(x)$ .)

The instantiation scheme is incomplete!

## Reason for incompleteness: holes

$$\forall a, (\forall k, P^\sharp(k, a[k])) \wedge (\forall k, Q^\sharp(k, a[k])) \implies R(a[0])$$

that is

$$\forall a, (\forall k, (P^\sharp \wedge Q^\sharp)(k, a[k])) \implies R(a[0])$$

$$(P^\sharp \wedge Q^\sharp)(k, x) \equiv x = 0 \wedge k \neq 1$$

“There is a hole at  $k = 1$ ”

## $\alpha$ not surjective / $\gamma$ not injective

There are multiple  $P^\sharp$  (and not only  $\emptyset$ ) such that  $\gamma(P^\sharp)$  is  $\emptyset$ .

A non minimal  $P^\sharp$  can “propagate” and induce overapproximation.

Would need a reduction function ( $\rho(P^\sharp) = \alpha \circ \gamma(P^\sharp)$ ) but how could I define it in Horn clauses...

# Syntactic restrictions

## Linear Horn clauses

Only one unknown predicate on the left hand side ( $P(n, i, a) \wedge i \neq n \implies R(n, i, a)$  is ok,  $P(n, i, a) \wedge Q(n, i, a) \wedge i \neq n \implies R(n, i, a)$  is not)

## No global predicates on arrays

Only access arrays at individual locations  $a[i]$ ,  $a[j \mapsto 42][i]$  etc.  
No “global” predicates ( $a = a'$ , etc)

Theorem: the abstraction is then complete!

# Intuition of the proof

“Everything happens in the image by  $\alpha$ .”

“There are no holes in arrays.”

“All partials arrays can be extended into full arrays.”

# Completeness in other words

Source = Horn clause problem with predicates on arrays

Question: solve this problem within an abstract domain ( $\gamma(P^\#)$ )

Replacement + instantiation + (optional) Ackermannization

= solve the question

(if syntactic restrictions not obeyed: may or may not solve the question even if there is a solution)

Implement an abstraction by syntactic transformation.

# Experimental results

<https://github.com/vaphor>

Tends to generate “hard” problems for Horn clause solvers (Z3, Eldarica...)

Can prove the correctness of some classical sorting algorithms (multiset is invariant + result is sorted) by inferring the necessary invariants.



# Completeness theorem

## Past work

<https://hal.science/hal-03214475v2>

<https://hal.science/tel-03771839v1>

<https://hal.science/hal-01337140v1>

<https://hal.science/hal-02948081v2>

<https://hal.science/hal-03321868v1>

## Work in progress

Clean up the completeness proof when some of the syntactic restrictions are removed.