

Horn Clauses for Program Analysis

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Overview

- Data-flow Analysis of Imperative Programs
- Set-based Analysis of Functional Programs
- Set-based Analysis of Logic Programs
- Horn Clauses for CCC

1. Dataflow Analysis

Idea

- ▶ Dataflow analysis computes for every program point a finite number of **facts**.
- ▶ The result can be represented as a recursively defined **finite relation**.

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- ▶ The result can be represented as a recursively defined **finite relation**.
- ▶ Recursive finite relations can be conveniently specified in **Datalog** and efficiently tabulated through standard fixpoint techniques.
- ▶ Structured terms are not essential but **convenient ...**

Related Work

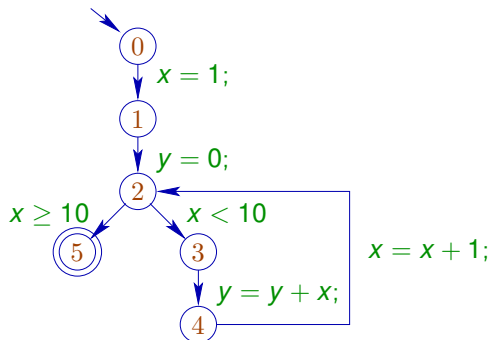
Datalog	...
Tabeled Resolution	...
Ganzinger/McAllester	2001
Nielson/Riis-Nielson/S.	2002

Representation of Programs

Control-flow Graph \Leftrightarrow Relation

Representation of Programs

Control-flow Graph \Leftrightarrow Relation



Representation of Programs

Control-flow Graph \Leftrightarrow Relation

var(<i>x</i>)	\Leftarrow
var(<i>y</i>)	\Leftarrow
edge(0, <i>assign</i> (<i>x</i> , 1), 1)	\Leftarrow
edge(1, <i>assign</i> (<i>y</i> , 0), 2)	\Leftarrow
edge(2, <i>test</i> (<i>op</i> (<i>less</i> , <i>x</i> , 10)), 3)	\Leftarrow
edge(3, <i>assign</i> (<i>y</i> , <i>op</i> (<i>plus</i> , <i>y</i> , <i>x</i>)), 4)	\Leftarrow
edge(4, <i>assign</i> (<i>x</i> , <i>op</i> (<i>plus</i> , <i>x</i> , 1)), 2)	\Leftarrow
edge(2, <i>test</i> (<i>op</i> (<i>geq</i> , <i>x</i> , 10)), 5)	\Leftarrow

Clauses for Liveness

$\text{live}(U, X) \Leftarrow \text{edge}(U, Lab, V), \text{used}(X, Lab)$

$\text{live}(U, X) \Leftarrow \text{edge}(U, Lab, V), \text{live}(V, X), \text{not}(\text{def}(X, Lab))$

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 $\text{not}(\text{def}(X, \text{Lab}))$

$\text{def}(X, \text{assign}(X, -)) \Leftarrow$

$\text{used}(X, \text{assign}(-, E)) \Leftarrow \text{occurs}(X, E)$

$\text{used}(X, \text{test}(E)) \Leftarrow \text{occurs}(X, E)$

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$\text{live}(U, X)$	\Leftarrow	$\text{edge}(U, Lab, V), \text{live}(V, X), \text{not}(\text{def}(X, Lab))$
$\text{def}(X, \text{assign}(X, -))$	\Leftarrow	
$\text{used}(X, \text{assign}(-, E))$	\Leftarrow	$\text{occurs}(X, E)$
$\text{used}(X, \text{test}(E))$	\Leftarrow	$\text{occurs}(X, E)$
$\text{occurs}(X, X)$	\Leftarrow	$\text{var}(X)$
$\text{occurs}(X, \text{op}(-, E))$	\Leftarrow	$\text{occurs}(X, E)$
$\text{occurs}(X, \text{op}(-, E1, E2))$	\Leftarrow	$\text{occurs}(X, E1)$
$\text{occurs}(X, \text{op}(-, E1, E2))$	\Leftarrow	$\text{occurs}(X, E2)$

Discussion

- ▶ The formulation requires the predicate `not/1`
 \implies stratified negation

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⇒ Topdown solving

Result for Liveness

live(1, x) \Leftarrow

live(2, x) \Leftarrow

live(3, x) \Leftarrow

live(4, x) \Leftarrow

live(2, y) \Leftarrow

live(3, y) \Leftarrow

live(4, y) \Leftarrow

Summary

- ▶ Horn clauses (with stratified negation) provide a convenient tool for dataflow analyses.
- ▶ The specification is program independent :-)
- ▶ **Topdown solving** provides an efficient algorithm for computing all valid dataflow facts.

2. Functional Programs

Idea

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- ▶ Describe these sets by means of regular **tree grammars** Jones 1987
- ▶ Use **set constraints** instead Heintze 1994
- ▶ Why not just **Horn clauses** ???

The append Function

```
let rec a = fun x → match x with
              [] → fun y → y
              h::t → fun y → h::a t y
in a [1; 2] [3]
```

The Horn Clauses

$\text{val}_a(\text{fun}(x, \text{match})) \Leftarrow$

$\text{val}_{\text{match}}(\text{fun}(y, y)) \Leftarrow \text{val}_x([])$

$\text{val}_{\text{match}}(\text{fun}(y, \text{cons})) \Leftarrow \text{val}_x(- :: -)$

$\text{val}_h(Z) \Leftarrow \text{val}_x(Z :: -)$

$\text{val}_{\text{cons}}(H :: T) \Leftarrow \text{val}_h(H), \text{val}_{a.t.y}(T)$

$\text{val}_{a.t.y}(Z) \Leftarrow \text{val}_{a.t}(\text{fun}(x, \text{match})), \text{val}_{\text{match}}(Z)$

...

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- ▶ All heads of the generated constraints are linear !
No variable occurs repeatedly in bodies !!

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- ▶ For every set of H_3 -clauses, there is an equivalent set of automata clauses.
- ▶ These can be found in polynomial time :-)

The Result

$$\text{val}_{\text{let}}(Z_1 :: Z_2) \quad \Leftarrow \quad \text{val}_3(Z_1), \text{val}_{[]} (Z_2)$$

$$\text{val}_{\text{let}}(Z_1 :: Z_2) \quad \Leftarrow \quad \text{val}_h(Z_1), \text{val}_{\text{a.t.y}}(Z_2)$$

$$\text{val}_{\text{a.t.y}}(Z_1 :: Z_2) \quad \Leftarrow \quad \text{val}_3(Z_1), \text{val}_{[]} (Z_2)$$

$$\text{val}_{\text{a.t.y}}(Z_1 :: Z_2) \quad \Leftarrow \quad \text{val}_h(Z_1), \text{val}_{\text{a.t.y}}(Z_2)$$

$$\text{val}_h(1) \quad \Leftarrow$$

$$\text{val}_h(2) \quad \Leftarrow$$

$$\text{val}_3(3) \quad \Leftarrow$$

$$\text{val}_{[]} ([]) \quad \Leftarrow$$

Discussion

- ▶ The analysis finds:

$$\{[x_1; \dots; x_k; 3] \mid x_i \in \{1, 2\}\}$$

- ▶ The analysis does not discover that the set of all occurring lists is finite :-)

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$$\{[x_1; \dots; x_k; 3] \mid x_i \in \{1, 2\}\}$$

- ▶ The analysis does not discover that the set of all occurring lists is finite :-(

▶ The clauses are **program-specific!**



The analysis consists of two steps:

- (1) Constraint generation
- (2) Constraint solving

Alternative: Set Constraints

Heintze 1994

$$\begin{aligned}
 \text{val}_a &\supseteq \{\mathbf{fun}(x, \text{match})\} \\
 \text{val}_{\text{match}} &\supseteq (\{\llbracket _ \rrbracket\} \cap \text{val}_x \neq \emptyset); \{\mathbf{fun}(y, y)\} \\
 \text{val}_{\text{match}} &\supseteq (_ :: _ \cap \text{val}_x \neq \emptyset); \{\mathbf{fun}(y, \text{cons})\} \\
 \text{val}_h &\supseteq \pi_{::,1} \text{val}_x \\
 \text{val}_{\text{cons}} &\supseteq \text{val}_h :: \text{val}_{a.t.y} \\
 \text{val}_{a.t.y} &\supseteq (\{\mathbf{fun}(x, \text{match})\} \cap \text{val}_{a.t} \neq \emptyset); \text{val}_{\text{match}} \\
 &\dots
 \end{aligned}$$

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- ▶ The analysis requires the set operators:

Projection $\pi_{::,j} X$

Constructor application $X :: Y$

Check $(e \cap X \neq \emptyset); Y$

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- ▶ All these can be modelled by H_3 -clauses $:-)$

Program-independent Formulation

$\text{val}(A, Z)$

\Leftarrow

$\text{val}(E, Z)$

...

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$\text{val}(A, Z) \quad \Leftarrow \quad \text{val}(E, Z)$

...

$\text{val}(\text{fun}(X, E), \text{fun}(X, E)) \quad \Leftarrow$

$\text{val}(H :: T, Z_1 :: Z_2) \quad \Leftarrow \quad \text{val}(H, Z_1), \text{val}(T, Z_2)$

Program-independent Formulation

$\text{reach}(\text{let}(a, \dots, \text{app}(\text{app}(a, [1; 2]), [3]))) \Leftarrow$

$\text{reach}(E) \Leftarrow \text{reach}(\text{let}(_, E, _))$

$\text{val}(A, Z) \Leftarrow$
 $\text{val}(E, Z)$

...

$\text{val}(\text{fun}(X, E), \text{fun}(X, E)) \Leftarrow$

$\text{val}(H :: T, Z_1 :: Z_2) \Leftarrow$
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Program-independent Formulation

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$\text{val}(A, Z) \Leftarrow \text{reach}(\text{let}(A, E, _)),$
 $\text{val}(E, Z)$

...

$\text{val}(\text{fun}(X, E), \text{fun}(X, E)) \Leftarrow \text{reach}(\text{fun}(X, E))$

$\text{val}(H :: T, Z_1 :: Z_2) \Leftarrow \text{reach}(H :: T),$
 $\text{val}(H, Z_1), \text{val}(T, Z_2)$

Discussion

- ▶ The rules both for functions and constructor applications violate the restrictions of our favorite class H_1 :-)

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- ▶ The rules both for functions and constructor applications violate the restrictions of our favorite class H_1 :-)
- ▶ Finiteness analysis of the predicate `reach/1` on the other hand, allows to instantiate variables with finite range !
- ▶ Instantiation will recover the extensive form :-)

Summary

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- ▶ A program-dependent specification can be obtained via H_3 -clauses — which can be recovered from general Horn clauses through **instantiate** of finite predicates :-)
- ▶ A trivial **finiteness analysis** may suffice.

3. Prolog

Idea

- ▶ Approximate the least model of a program via **set constraints** **Heintze/Jaffar 1990**

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- ▶ Use **uniform** Horn clauses instead! Frühwirth et al. 1991
- ▶ Why not approximate with H_1 ?
Weidenbach 1999
Nielson/Riis-Nielson/S. 2002
Goubault-Larrecq 2005

The Class of H_1 -Clauses

H_1 -Clauses are of the form:

$$p(X_1, \dots, X_k) \Leftarrow \text{any} \quad \text{or} \quad p(a(X_1, \dots, X_k)) \Leftarrow \text{any}$$

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For any set of H_1 -clauses an equivalent set of automata clauses can be constructed in exponential time :-)

Any set of Horn clauses can be approximated by a set of H_1 -clauses :-)

Example: append

$\text{app}([], Y, Y) \Leftarrow$
 $\text{app}([H|T], Y, [H|Z]) \Leftarrow \text{app}(T, Y, Z)$
 $\Leftarrow \text{app}([1, 2], [3], Z)$

... results in:

The H_1 -Approximation

$$\text{app}(Z, Y, Y') \quad \Leftarrow \quad \text{aux}_{[]} (Z)$$

$$\text{aux}_{[]} ([]) \quad \Leftarrow$$

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$$\text{app}(Z_1, Y, Z_2) \Leftarrow \text{aux}_{[H|T]} (Z_1), \text{aux}_{[H|Z]} (Z_2), \text{app}(T, Y, Z)$$

The H_1 -Approximation

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$$\text{aux}_{[H|T]} ([H|T]) \Leftarrow \text{app}(T, Y, Z)$$

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...

... with the Result:

$\text{val}_Z([Z_1|Z_2]) \Leftarrow \text{top}(Z_1), \text{aux}(Z_2)$

$\text{val}_Z([Z_1|Z_2]) \Leftarrow \text{top}(Z_1), \text{top}(Z_2)$

$\text{aux}([]) \Leftarrow$

$\text{aux}([Z_1|Z_2]) \Leftarrow \text{top}(Z_1), \text{aux}(Z_2)$

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Listness and all information about the content of the result is lost :-)

Discussion

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- ▶ Better results can be obtained if additionally **call patterns** are tracked !

⇒⇒ Magic Set Transformation

Magic Sets

- ▶ For every predicate p/k , we introduce a new predicate called_p/k with the clauses

$$\text{called}_p(\underline{t}) \Leftarrow \text{for the query } \Leftarrow p(\underline{t})$$

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- ▶

$$\text{called}_{p_i}(\underline{t}_i) \Leftarrow \text{called}_p(\underline{t}), p_1(\underline{t}_1), \dots, p_{i-1}(\underline{t}_{i-1})$$

$$p_i(\underline{t}) \Leftarrow \text{called}_p(\underline{t}), p_1(\underline{t}_1), \dots, p_{i-1}(\underline{t}_m)$$

for every clause:

$$p(\underline{t}) \Leftarrow p_1(\underline{t}_1), \dots, p_m(\underline{t}_m)$$

Example: append (Cont.)

`app([], Y, Y)` \Leftarrow `called([], Y, Y)`
`app([H|T], Y, [H|Z])` \Leftarrow `called([H|T], Y, [H|Z]),`
`app(T, Y, Z)`
`called(T, Y, Z)` \Leftarrow `called([H|T], Y, [H|Z])`
`called([1, 2], [3], Z)` \Leftarrow

The H_1 -Approximation (Cont.)

$$\text{val}_Z([Z_1|Z_2]) \Leftarrow \text{val}_2(Z_1), \text{aux}_1(Z_2)$$

$$\text{val}_Z([Z_1|Z_2]) \Leftarrow \text{val}_1(Z_1), \text{aux}_2(Z_2)$$

$$\text{aux}_1([Z_1|Z_2]) \Leftarrow \text{val}_3(Z_1), \text{val}_{[]} (Z_2)$$

$$\text{aux}_2([Z_1|Z_2]) \Leftarrow \text{val}_2(Z_1), \text{aux}_1(Z_2)$$

$$\text{aux}_2([Z_1|Z_2]) \Leftarrow \text{val}_1(Z_1), \text{aux}_2(Z_2)$$

$$\text{val}_i(i) \Leftarrow$$

$$\text{val}_{[]}([]) \Leftarrow$$

Alternative: Set Constraints

Heintze/Jaffar 1990

- ▶ The analysis requires the set operators:

Projection $\pi_{::,j} X$

Constructor application $X :: Y$

Check $(e \cap X \neq \emptyset); Y$

Intersection $X \cap Y$

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- ▶ All these can be modelled by H_1 -clauses :-)
- ▶ Set constraints still are less precise ...

Precision

The H_1 -clause:

$$p(a(X, Y)) \Leftarrow q(b(X, Y))$$

is approximated by the set constraint:

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... which for

$$\text{val}_q = \{b(1, 2), b(2, 1)\}$$

returns:

$$\text{val}_p = \{a(1, 1), a(1, 2), a(2, 1), a(2, 2)\}$$

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- ▶ Better results can be hoped for by taking the query into account via Magic Sets :-)

4. Concurrent Cryptographic C

The Idea

Goubault-Larrecq 2005

- ▶ Do not just analyze **cryptographic** protocols — but their implementation in a standard programming language !!!

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The Idea

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- ▶ Do not just analyze **cryptographic** protocols — but their implementation in a standard programming language !!!
- ▶ For the protocol assume **perfect cryptography** which is supported by a datatype **msg** and language primitives.
- ▶ Programs write and read from a public channel which is controlled by the **attacker**.

Example

```
...  
while (true) {  
     $x_1 \leftarrow \text{recv}()$ ;  
     $x_2 \leftarrow \text{enc}(\text{second}(x_1), \text{pub}_A)$ ;  
    if ( $x_2 = \text{hash}(\text{first}(x_1))$ ) {  
         $x_3 \leftarrow \text{enc}(\text{code}, \text{pub}_A)$ ;  
        send( $x_3$ );  
    }  
}
```

Approach

- ▶ A predicate `reach`/`1` checks reachability of program points u .
- ▶ A predicate `val` _{u,x} /`1` collects all values of x when reaching u .
- ▶ Decryption is implemented through pattern matching.
- ▶ The capabilities of the attacker are modelled with Horn clauses ...

Some Constraints

`known(Z)` \Leftarrow `chan(Z)`

`chan(Z)` \Leftarrow `known(Z)`

`valx1(Z)` \Leftarrow `reach(1), chan(Z)`

`valx2(Z)` \Leftarrow `reach(2), valx1(pair(-, enc(Z, secrA)))`

`reach(2)` \Leftarrow `reach(1)`

...

`reach(3)` \Leftarrow `reach(2), valx1(pair(Z1, -)), valx2(hash(Z1))`

...

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 - ⇒ further approximation is necessary !
 - ⇒ precision may be gained through instantiation ...
 - ⇒ or magic sets :-)

Conclusion

- ▶ We have seen that Horn clauses are a decent formalism for the specification of program analyses.
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- ▶ **Topdown solving** allowed for program independent specifications of dataflow problems.
- ▶ **Instantiation** allowed for for program independent specifications also for functional programs.
- ▶ **Magic sets** enable decent results also for Prolog.
- ▶ The last two may also be useful for CCC.