# The VeriMAP system for program transformation and verification

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### **Outline**

- Constrained Horn Clauses (CHC) for verification
- CHC transformation rules and strategies
- Semantics-based translation to CHC
- CHC specialization as CHC solving
- Verification of relational properties (e.g. equivalence, functionality, non-interference)
- Verification of programs with inductively-defined data structures (e.g., lists and trees)
- Verification of time-aware business processes
- VeriMAP demo

# **Constrained Horn Clauses (CHC)**

Constrained Horn Clauses (aka Constraint Logic Programs):

$$A_0 \leftarrow c, A_1, \dots, A_n$$

where: (1)  $A_0$  is *false* or an *atom*, (2)  $A_1$ , ...,  $A_n$ ,  $n \ge 0$ , are *atoms*, and (3) c is a *constraint* in a first order theory Th. All variables are assumed to be universally quantified in front

### Many verification problems can be encoded as CHC satisfiability

- Satisfiability: Given a set P of CHC, has P ∪ Th a model?
- Solving: Compute a model of P ∪ Th, expressed in Th (if sat) or return unsat; solvability implies satisfiability, not vice versa
- CHC solvers: SMT solvers for the Horn fragment with Linear Integer/Real Arithmetic, Booleans, Arrays, Lists, Bit-vectors (e.g., Z3 (SPACER), Eldarica, HSF, MathSAT, Hoice, RAHFT/PECOS, VeriMAP, ...)
- CHC tools: Ciao, SeaHorn, ...

# Imperative program verification via CHC solving

• Summing the first *n* integers

```
Specification \{n>=0\} x=0; y=0; while (x<n) \{x=x+1; y=x+y\} \{y>=x\}
```



Translation

### **Constrained Horn Clauses**

```
p(X, Y, N) \leftarrow N>=0, X=0, Y=0 %Init p(X1, Y1, N) \leftarrow X<N, X1=X+1, Y1=X1+Y, p(X, Y, N) %Loop false \leftarrow X>=N, Y<X, p(X, Y, N) %Exit
```

Solution (i.e., model) of the CHCs:

$$p(X, Y, N) \mapsto X>=0, Y>=X$$

• CHC are solvable, hence satisfiable, and the specification is valid

### CHC transformation for verification

- CHC transformations
  - propagate constraints (backward and forward)
    - Unfolding and constraint solving
  - discover inductive invariants (also using widening & convex-hull)
    - Definition and folding
  - discover relations among predicates
- CHC transformations
  - preserve satisfiability
  - preserve solvability, and can improve it
  - can improve the effectiveness of state-of-the-art CHC solvers

# CHC transformation rules and strategies

# Transformations of Functional and Logic Programs

Transformation techniques introduced for improving functional and logic programs [Burstall-Darlington 1977, Tamaki-Sato 1984] can be adapted to ease satisfiability proofs for CHCs.

Initial program  $P_0 \rightarrow P_1 \rightarrow ... \rightarrow P_n$  Final program

where  $\rightarrow$  is an application of a transformation rule.

- Each rule application preserves the semantics:  $M(P_0) = M(P_1) = ... = M(P_n)$
- The application of the rules is guided by a strategy that guarantees that  $P_n$  is more efficient than  $P_0$ .

**Initial clauses** 

$$S_0 \rightarrow S_1 \rightarrow \ldots \rightarrow S_n$$

Final clauses

where '→' is an application of a transformation rule.

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- R1. Definition. Introduce a new predicate definition introduce C: newp(X):- c, G
  - $S_{i+1} = S_i \cup \{C\}$  Defs := Defs  $\cup \{C\}$

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 $S_{i+1} = S_i \cup \{C\}$  Defs := Defs  $\cup \{C\}$ 

R2. Unfolding. Apply a Resolution step

given C: H := c, A, G  $A := d_1, G_1 ... A := d_m, G_m in S_i$ 

derive  $S = \{ H := c, d_1, G_1, G ... H := c, d_m, G_m, G \}$ 

 $S_{i+1} = (S_i - \{C\}) \cup S_i$ 

R3. Folding. Replace a conjunction with a new predicate given C: H := d,B,G in  $S_i$  newp(X):- c,B. with  $d \rightarrow c$  in Defs derive D: H := d,newp(X),G.

```
S_{i+1} = (S_i - \{C\}) \cup \{D\}
```

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R4. Constraint replacement. Replace a constraint with an equivalent one given C: H := c,B,G in  $S_i$  with  $Th \models c \Leftrightarrow d$  derive D: H := d,B,G  $S_{i+1} = (S_i - \{C\}) \cup \{D\}$ 

R3. Folding. Replace a conjunction with a new predicate

```
given C: H := d,B,G in S_i newp(X): = c,B. with Th \models d \rightarrow c in Defs derive D: H := d,newp(X),G. S_{i+1} = (S_i - \{C\}) \cup \{D\}
```

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given C: H := c,B,G in S_i with Th \models c \Leftrightarrow d derive D: H := d,B,G S_{i+1} = (S_i - \{C\}) \cup \{D\}
```

R5. Clause Removal. Remove a clause C with unsatisfiable constraint or subsumed by another

$$S_{i+1} = (S_i - \{C\})$$

R3. Folding. Replace a conjunction with a new predicate

```
given C: H := d,B,G in S_i newp(X) := c,B. with Th \models d \rightarrow c in Defs derive D: H := d,newp(X),G. S_{i+1} = (S_i - \{C\}) \cup \{D\}
```

R4. Constraint replacement. Replace a constraint with an equivalent one

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given C: H := c,B,G in S_i with Th \models c \leftrightarrow d derive D: H := d,B,G S_{i+1} = (S_i - \{C\}) \cup \{D\}
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R5. Clause Removal. Remove a clause C with unsatisfiable constraint or subsumed by another

$$S_{i+1} = (S_i - \{C\})$$

Theorem [Tamaki-Sato 84,Etalle-Gabbrielli 96]: If every new definition is unfolded at least once in  $S_0 \rightarrow S_1 \rightarrow \dots \rightarrow S_n$  then

 $S_0$  satisfiable iff  $S_n$  satisfiable

# Transformation strategies

- Transformation rules need to be guided by suitable strategies.
- Main idea: exploit some knowledge about the query to produce a customized, easier to verify set of clauses.
- Specialization [Gallagher,Leuschel,FPP,...]: Given a set of clauses S and a query false:-c,A, where A is atomic, transform S into a set of clauses S<sub>SP</sub> such that S U {false:-c,A} satisfiable iff S<sub>SP</sub> U {false:-c,A} satisfiable.
- Predicate Tupling (also known as Conjunctive Partial Deduction) [PP, Leuschel,...]: Given a set of clauses S and a query false: c,G, where G is a (non-atomic) conjunction, introduce a new predicate newp(X): G and transform set of clauses S<sub>T</sub> such that S U {false: c,G} satisfiable iff S<sub>T</sub> U {false: c,newp(X)} satisfiable.

false :- 
$$X<0$$
,  $p(X,b)$ .

$$p(X,C) := X=Y+1, p(Y,C).$$

p(X,a).

$$p(X,b) := X > = 0$$
, tm\_halts(X).

$$\% \forall X. p(X,b) \rightarrow X>=0$$

% the X-th Turing machine halts on X

 $S_0$ 

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$$\% \forall X. p(X,b) \rightarrow X>=0$$

 $S_0$ 

% the X-th Turing machine halts on X

Define:

$$q(X) := X < 0, p(X,b).$$

% q(X) is a specialization of p(X,C)

 $S_1$ 

% to a specific constraint on X and value of C

false :- 
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 $S_1$ 

% to a specific constraint on X and value of C

Unfold: 
$$q(X) := X<0, X=Y+1, p(Y,b).$$

 $S_2$ 

$$q(X) := X<0, X>=0, tm_halts(X).$$
 % clause removal

false :- 
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 $S_1$ 

 $S_0$ 

% to a specific constraint on X and value of C

Unfold: 
$$q(X) := X<0, X=Y+1, p(Y,b).$$

 $S_2$ 

$$q(X) := X<0, X>=0, tm_halts(X).$$
 % clause removal

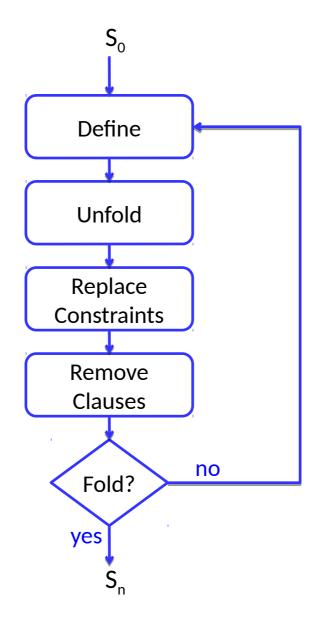
Fold: false :- 
$$X<0$$
,  $q(X)$ .

$$q(X) := X<0, X=Y+1, q(Y).$$

 $S_3$ 

Satisfiability of  $S_3$  is easy to check: q(X) = false makes all clauses true (no facts for q)

# A Generic U/F Transformation Strategy

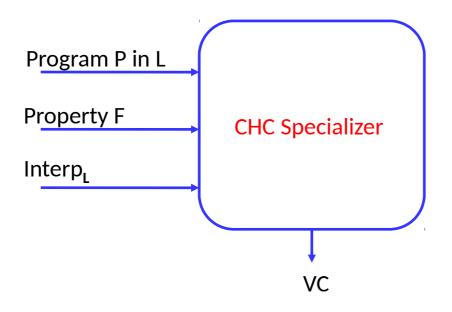


# Some Issues About the U/F Strategy

- Unfolding: Which atoms should be unfolded? When to stop?
- Constraint replacement: A suitable constraint reasoner is needed
- Definition: Suitable new predicates need to be introduced to guarantee termination and effectiveness of strategy
  - Definitions are arranged in a tree
  - New definitions possibly contain a generalized constraint
    - newp:-d, B ancestor definition
    - newp :- c, B candidate definition
    - newp:-g, B generalized definition  $c \rightarrow g=gen(c,d)$
  - Generalization operators based on widening and convex-hull
     [Cousot-Cousot 77, Cousot-Halbwachs 78, Bagnara et al. 08]

# Semantics-based translation to CHC Verification Conditions

### CHC Specialization as a Verification Condition Generator



L: Programming language

Interp<sub>I</sub>: CHC interpreter for L

VC: Verification Conditions, i.e., a set of CHCs independent of L

F holds for P iff VC is satisfiable

The CHC specializer is parametric with respect to the programming language L and the class of properties.

# **Translating Imperative Programs into CHC**

- C-like imperative language with assignments, conditionals, jumps.
   While-loops translated to conditionals and jumps.
- Commands encoded as atomic assertions: at(Label, Cmd).

```
at(\mathbf{0}, asgn(int(x), int(0))).
x=0:
                         0. x=0:
                                                       at(1,asgn(int(y),int(0))).
                          1. y=0;
v=0:
                                                       at(2, ite(less(int(x), int(n)), 3, 6)).
                         2. if (x<n) 3 else 6;
while (x<n) {
                                                       at(3, asgn(int(x), plus(int(x), int(1)))).
 x=x+1:
                         3. x=x+1:
                                                       at(4, asgn(int(y), plus(int(x), int(y)))).
                         4. y=x+y;
 y=x+y
                                                       at(5, goto(2)).
                          5. goto 2;
                                                       at(h, halt).
                         h. halt
```

# A Small-Step Operational Semantics

The operational semantics is a one-step transition relation between configurations

```
<n:cmd, env> \Rightarrow <n':cmd', env'>
```

where: n:cmd is a labelled command

env is an environment mapping variable identifiers to values

Assignment

```
<n: x=e, env> \Rightarrow <next(n), update(env, x, [e]env)>
next(n) is the next labelled command
update(env, x, [e]env) updates the value of x to the value of expression e in env
```

Conditional

```
<n: if (e) n1 else n2, env> \Rightarrow <at(n1), env> if [e]env≠0 <n: if (e) n1 else n2, env> \Rightarrow <at(n2), env> if [e]env=0
```

at(n) is the labelled command with label n

Jump

<n: goto n1, env>  $\Rightarrow$  <at(n1), env>

# A CHC Interpreter for the Small-Step Semantics

Configurations: cf(LC, Env)

#### where:

- LC is a labelled command represented as a term of the form cmd(L,C),

L is a label, C is a command

- Env is an environment represented as a list of (variable-id, value) pairs:

[(x,X),(y,Y),(z,Z)]

One-step transition relation between configurations:

tr(cf(LC1,Env1), cf(LC2,Env2))

# **CHC Interpreter (Asgn)**

More clauses for predicate tr to encode the semantics of the other commands.

# **Encoding Partial Correctness Properties**

Partial correctness specification (Hoare triple):

```
\{\phi\} prog \{\psi\}
```

If the initial values of the program variables satisfy the precondition  $\phi$  and prog terminates, then the final values of the program variables satisfy the postcondition  $\psi$ .

CHC encoding of partial correctness:

```
\label{eq:false:-initConf} \begin{array}{ll} \text{false:-initConf}(\text{Cf}), \, \text{errReach}(\text{Cf}). \\ \text{errReach}(\text{Cf}) :- \, \text{errorConf}(\text{Cf}). \\ \text{errReach}(\text{Cf}) :- \, \text{tr}(\text{Cf},\text{Cf2}), \, \text{errReach}(\text{Cf2}). \\ \text{initConf}(\text{cf}(\text{C}, \, \text{Env})) :- \, \text{at}(0,\text{C}), \, \varphi(\text{Env}). \\ \text{errorConf}(\text{cf}(\text{C}, \, \text{Env})) :- \, \text{at}(\text{h},\text{C}), \, \neg \psi(\text{Env}). \\ \text{tr}(\text{Cf1},\text{Cf2}) :- \, \dots & \text{Interp}_{\text{L}} \end{array}
```

{φ} prog {ψ} is valid iff PC-prop is satisfiable.

# Problems of direct CHC encoding

- PC-prop includes a lot of complex structures and predicates:
  - complex terms encoding configurations:

```
cf(cmd(L,asgn(X,Expr)),[(x,1),(y,0),(a,[2,3,4])])
```

recursive predicates over lists encoding functions on the environment:

```
update([(X,N)|Bs],X,V,[(X,V)|Cs]) :- .... update(Bs,X,V,Cs)
```

 State-of-the-art CHC solvers hardly terminate when checking the satisfiability of PC-prop

# **VCGen:** Generating Verification Conditions

VCGen is a transformation strategy that specializes PC-prop to a given  $\{\phi\}$  prog  $\{\psi\}$ ,

removes explicit reference to the interpreter (function cf, predicates at, tr, etc.).

- All new definitions are of the form newp(X) :- errReach(cf(LC,Env)), corresponding to a program point.
  - Limited reasoning about constraints at specialization time (satisfiability only).
- VCGen is parametric wrt Interp<sub>L</sub> (to a large extent).
- If PC-prop VCGen

  VCGen

  VC then PC-prop is satisfiable iff VC is satisfiable
  - no complex terms or lists occur in VC

# Generating Verification Conditions: An Example

### PC property:

 ${n>=1}$  SumUpto  ${y>x}$ 

### **CHC** encoding:

false :- initConf(Cf), errReach(Cf). PC-properrReach(Cf) :- errorConf(Cf). errReach(Cf1) :- tr(Cf1,Cf2), errReach(Cf2). initConf(cf(C, [(x,X),(y,Y),(n,N)])) :- at(0,C), N>=1. errorConf(cf(C, [(x,X),(y,Y),(n,N)])) :- at(h,C),  $Y \leq X$ . tr(Cf1,Cf2) :- ... ... at(0,asgn(int(x), int(0))). ...

**VCGen** 

# Verification Conditions:

false :- N>=1, X=0, Y=0, p(X, Y, N). p(X, Y, N) :- X < N, X1=X+1, Y1=Y+2, p(X1, Y1, N). $p(X, Y, N) :- X>=N, Y \le X.$ 

### Two semantics for function calls

- Small-Step semantics (SS)
  - "dives into" the function definition
  - VC are linear clauses (one atom in the body)
- Multi-Step semantics (MS)
  - "wraps" the whole function call  $\Rightarrow$  is defined in terms of  $\Rightarrow$ \*
  - VC are non-linear
  - reach(C,C).
    reach(C,C2) :- tr(C,C1), reach(C1,C2).

```
false :- initConf(C1), reach(C1,C2), errorConf(C2).
```

more variables (use variants of Leuschel's Redundant Argument Filtering)

# Properties of VCGen

- The number of transformation steps is linear wrt the size of the imperative program P
- The size of VC (the number of CHC) is linear wrt the size of program P

# Short demo

# **Experimental evaluation**

- Other semantics: exceptions, etc.
- Checking the satisfiability of the VCs using QARMC, Z3 (PDR), MathSAT (IC3), Eldarica
- VCGen+QARMC compares favorably to HSF+QARMC

|                   | Small-step $(SS_f^s)$ |         |         |         | Multi-step (MS) |         |         |         | HSF(C) |
|-------------------|-----------------------|---------|---------|---------|-----------------|---------|---------|---------|--------|
|                   | QARMC                 | Z3      | MSAT    | ELD     | QARMC           | Z3      | MSAT    | ELD     |        |
| Correct answers   | 217                   | 208     | 205     | 217     | 210             | 196     | 177     | 182     | 189    |
| safe problems     | 161                   | 150     | 158     | 158     | 160             | 144     | 147     | 141     | 158    |
| unsafe problems   | 56                    | 58      | 47      | 59      | 50              | 52      | 30      | 41      | 31     |
| Incorrect answers | 5                     | 0       | 3       | 2       | 3               | 0       | 1       | 0       | 12     |
| false alarms      | 3                     | 0       | 1       | 0       | 1               | 0       | 1       | 0       | 3      |
| missed bugs       | 2                     | 0       | 2       | 2       | 2               | 0       | 0       | 0       | 9      |
| Timeouts          | 98                    | 112     | 112     | 101     | 120             | 124     | 142     | 138     | 119    |
| Total problems    | 320                   | 320     | 320     | 320     | 320             | 320     | 320     | 320     | 320    |
| VCG time          | 221.68                | 221.68  | 221.68  | 221.68  | 141.85          | 141.85  | 141.85  | 141.85  |        |
| Solving time      | 3656.24               | 4221.39 | 2988.86 | 8809.58 | 2674.00         | 2704.95 | 1896.96 | 2779.18 |        |
| Total time        | 3877.92               | 4443.07 | 3210.54 | 9031.26 | 2815.85         | 2846.80 | 2038.81 | 2921.03 |        |
| Average Time      | 17.87                 | 21.36   | 15.66   | 41.62   | 13.41           | 14.52   | 11.52   | 16.05   |        |

### **Comments**

- Semantics-based Verification Condition generation is efficient and flexible
- Experiments with C, BPMN (business processes), Erlang (ongoing)
- Future work
  - More language semantics
    - Use formal semantics specifications of the K-Framework [Rosu et al.] ANSI C, OCaml, Python, PHP, Java, Javascript, Ethereum Virtual Machine...
  - Make it accessible to third parties
    - improve documentation
- References
  - [DFPP PPDP 15], [DFPP-ScienceCompProgr 16]
  - http://map.uniroma2.it/VeriMAP
  - http://map.uniroma2.it/vcgen

# Short demo

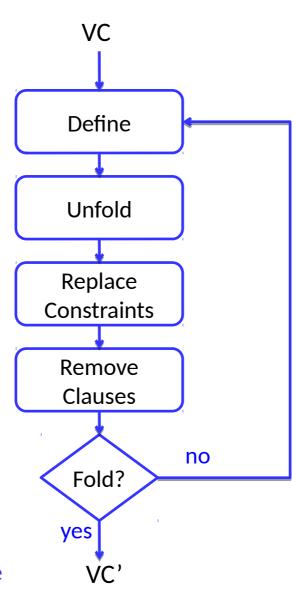
# **CHC Specialization as CHC Solving**

# **VCTransf: Specializing Verification Conditions**

false :- c, p(X)

newp(X) := c, p(X)

apply theory of constraints



Specializing verification conditions by propagating constraints.

Introduction of new predicates by generalization (e.g., widening and convex hull techniques)

VC is satisfiable iff VC' is satisfiable

## **VCTransf as CHC Solving**

The effect of applying VCTransf can be:

- 1. A set VC' of verification conditions without constrained facts for the predicates on which the queries depend (i.e., no clauses of the form p(X) :- c).

  VC' is satisfiable.
- 2. A set VC' of verification conditions including false :- true. VC' is unsatisfiable.
- 3. Neither 1 nor 2 (constrained facts of the form p(X) :- c, but not false :- true). Satisfiability is unknown.

propagation of constraint X<0 and constant b



false :- 
$$X<0$$
,  $q(X)$ .  $VC'$   $q(X) :-  $X<0$ ,  $X=Y+1$ ,  $q(Y)$ .$ 

No constrained facts: VC' satisfiable

## **Iterated CHC Specialization**

- If the satisfiability of VC' is unknown VCTransf can be iterated.
- Between two applications of VCTransf we can apply the Reversal transformation
   (particular case of the query-answer transformation [KafleGallagher 15] for linear
   programs) that interchanges premises and conclusions of clauses (backward reasoning
   from queries simulates forward reasoning from facts).

false :- 
$$a(X)$$
,  $p(X)$ .

 $p(X)$  :-  $c(X,Y)$ ,  $p(Y)$ .

 $p(X)$  :-  $b(X)$ .

VC is satisfiable iff VC' is satisfiable

$$VC_0 \xrightarrow{VCTransf} VC_1 \xrightarrow{Reversal} VC_2 \xrightarrow{VCTransf} VC_3 \cdots \xrightarrow{VCTransf} VC_n$$

false :- N>=1, X=0, Y=0, p(X, Y, N).  $VC_0$ p(X, Y, N) :- X<N, X1=X+1, Y1=Y+2, p(X1, Y1, N). p(X, Y, N) :- X>=N, Y<X.

```
false :- N>=1, X=0, Y=0, p(X, Y, N). VC_0
p(X, Y, N) :- X<N, X1=X+1, Y1=Y+2, p(X1, Y1, N).
p(X, Y, N) :- X>=N, Y<X.
```

#### **VCTransf**

```
false :- N>=1, X1=1, Y1=1, new2(X1, Y1, N).

new2(X, Y, N) :- X=1, Y=1, N>1, X1=2, Y1=3, new3(X1, Y1, N).

new3(X, Y, N) :- X1>=1, Y1>=X1, X<N, X1=X+1, Y1=X1+Y, new3(X1, Y1, N).

new3(X, Y, N) :- Y>=1, N>=1, X>=N, Y<X.
```

#### **VCTransf**

```
false :- N>=1, X1=1, Y1=1, new2(X1, Y1, N).

new2(X, Y, N) :- X=1, Y=1, N>1, X1=2, Y1=3, new3(X1, Y1, N).

new3(X, Y, N) :- X1>=1, Y1>=X1, X<N, X1=X+1, Y1=X1+Y, new3(X1, Y1, N).

new3(X, Y, N) :- Y>=1, N>=1, X>=N, Y<X.
```

#### Reversal

#### **VCTransf**

```
false :- N>=1, X1=1, Y1=1, new2(X1, Y1, N).

new2(X, Y, N) :- X=1, Y=1, N>1, X1=2, Y1=3, new3(X1, Y1, N).

new3(X, Y, N) :- X1>=1, Y1>=X1, X<N, X1=X+1, Y1=X1+Y, new3(X1, Y1, N).

new3(X, Y, N) :- Y>=1, N>=1, X>=N, Y<X.
```

#### Reversal

```
new2(X1, Y1, N):- N>=1, X1=1, Y1=1.

new3(X1, Y1, N):- X=1, Y=1, N>1, X1=2, Y1=3, new2(X, Y, N).

new3(X1, Y1, N):- X1>=1, Y1>=X1, X<N, X1=X+1, Y1=X1+Y, new3(X, Y, N).

false:- N>=1, Y>=1, X>=N, Y<X, new3(X, Y, N).
```

#### **VCTransf**

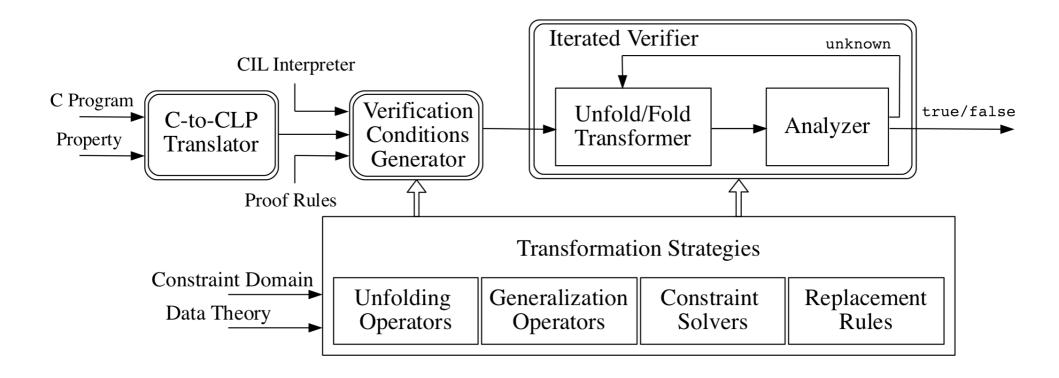
```
false :- N>=1, Y>=1, X>=N, Y<X, new4(X, Y, N). VC<sub>3</sub>
```

No constrained facts. VC<sub>3</sub> is satisfiable

VC.

VC<sub>2</sub>

### VeriMAP architecture



# Short demo

## **Experimental evaluation**

216 examples taken from: DAGGER, TRACER, InvGen, and TACAS 2013 Software Verification Competition.

- ARMC [Podelski, Rybalchenko PADL 2007]
- HSF(C) [Grebenshchikov et al. TACAS 2012]
- TRACER [Jaffar, Murali, Navas, Santosa CAV 2012]

|    |                    | VeriMAP (Gen <sub>PH</sub> )  | ARMC      | HSF(C)    | TRACER    |           |  |
|----|--------------------|-------------------------------|-----------|-----------|-----------|-----------|--|
|    |                    | vernviAF (Genp <sub>H</sub> ) | ARMC      | HSF(C)    | SPost     | WPre      |  |
| 1  | correct answers    | 185                           | 138       | 159       | 91        | 103       |  |
| 2  | safe problems      | 154                           | 112       | 137       | 74        | 85        |  |
| 3  | unsafe problems    | 31                            | 26        | 22        | 17        | 18        |  |
| 4  | incorrect answers  | 0                             | 9         | 5         | 13        | 14        |  |
| 5  | false alarms       | 0                             | 8         | 3         | 13        | 14        |  |
| 6  | missed bugs        | 0                             | 1         | 2         | 0         | 0         |  |
| 7  | errors             | 0                             | 18        | 0         | 20        | 22        |  |
| 8  | timed-out problems | 31                            | 51        | 52        | 92        | 77        |  |
| 9  | total score        | 339 (0)                       | 210 (-40) | 268 (-28) | 113 (-52) | 132 (-56) |  |
| 10 | total time         | 10717.34                      | 15788.21  | 15770.33  | 27757.46  | 23259.19  |  |
| 11 | average time       | 57.93                         | 114.41    | 99.18     | 305.03    | 225.82    |  |

Table 1: Verification results using VeriMAP, ARMC, HSF(C) and TRACER. For each column the sum of the values of lines 1, 4, 7, and 8 is 216, which is the total number of the verification problems we have considered. The timeout limit is five minutes. Times are in seconds.

## **Array constraints**

• if a[i] = v then read(A,I,V) holds

• if a[i] := v then write(A,I,V,B) holds, that is

B is an array identical to A except that B has value V in position I

• Constraint Handling Rules [Frühwirth et al.] for constraint reasoning

```
Array-Congruence-1: if i=j then a[i]=a[j]

read(A,I,X) \ read(A1,J,Y) \Leftrightarrow A=A1,I=J | X=Y.
```

Array-Congruence-2: if a[i]<>a[j] then i<>j

 $read(A,I,X),read(A1,J,Y) \Rightarrow A=A1, X<>Y \mid I<>J.$ 

Read-Over-Write:  $\{a[i]=x; y=a[j]\}$  if i=j then x=y

write(A,I,X,A1) \ read(A2,J,Y)  $\Leftrightarrow$  A1==A2 | (I=J,X=Y); (I<>J,read(A,J,Y)).

## Array constraint generalization

Logic variables are decorated with identifiers of the imperative program

: ancestor definition

```
\label{eq:new3} \begin{split} \text{new3}(\text{I},\text{N},\text{A}) := & \text{E+1=F}, \text{E} \geq 0, \text{I} > \text{F}, \text{G} \geq \text{H}, \text{N} > \text{F}, \text{N} \leq \text{I+1}, \\ & \text{read}(\text{A},\text{E}^{\text{j}},\text{G}^{\text{a}[\text{j}]}), \text{read}(\text{A},\text{F}^{\text{j1}},\text{H}^{\text{a}[\text{j1}]}), \text{reach}(\text{I},\text{N},\text{A}). \end{split}
```

: candidate definition

```
\label{eq:new4} \begin{split} \text{new4}(\text{I},\text{N},\text{A}) := & \text{E+1=F}, \text{E} \geq 0, \text{I} > \text{F}, \text{G} \geq \text{H}, \text{I=1+I1}, \text{I1+2} \leq \text{C}, \text{N} \leq \text{I1+3}, \\ & \frac{\text{read}(\text{A},\text{E}^{\text{j}},\text{G}^{\text{a}[\text{j}]}), \text{read}(\text{A},\text{F}^{\text{j1}},\text{H}^{\text{a}[\text{j1}]})}{\text{reach}(\text{I},\text{N},\text{A}).} \end{split}, \quad \underbrace{\text{read}(\text{A},\text{P}^{\text{i}},\text{Q}^{\text{a}[\text{i}]}), \\ \text{reach}(\text{I},\text{N},\text{A}). \end{split}
```

: **generalized** definition

```
\begin{array}{l} \text{new5}(\text{I},\text{N},\text{A}):-\text{E+1=F},\text{E}{\geq}0,\text{I}{>}\text{F},\text{G}{\geq}\text{H},\text{N}{>}\text{F},\\ \\ \underline{\text{read}}(\text{A},\text{E}^{\text{j}},\text{G}^{\text{a}[\text{j}]}),\text{read}(\text{A},\text{F}^{\text{j}1},\text{H}^{\text{a}[\text{j}1]})},\text{ reach}(\text{I},\text{N},\text{A}). \end{array}
```

# **Experimental evaluation**

Table 1. Verification results using VeriMAP and Z3 on a set of 88 verification problems: the verification precision (that is, the number of solved problems) and the average time. Times are in seconds.

| (1) G = VCGen                                     |            |              |               |              |            |              |            |              |
|---|------------|--------------|---------------|--------------|------------|--------------|------------|--------------|
| average time                                      | 0.1        |              |               |              |            |              |            |              |
| (2) GZ = VCGen; Z3                                |            |              |               |              |            |              |            |              |
| verification precision 49                         |            |              |               |              |            |              |            |              |
| average time                                      |            |              |               | 3.5          |            |              |            |              |
| $\boxed{(3) \ GT = VCGen \ ; \ VCTransf}$         |            |              |               |              |            |              |            |              |
| Gen function parameters                           | $H,I,\cap$ | $H,I,\equiv$ | $H,A,\cap$    | $H,A,\equiv$ | $W,I,\cap$ | $W,I,\equiv$ | $W,A,\cap$ | $W,A,\equiv$ |
| verification precision                            | 60         | 70           | 74            | 71           | 34         | 35           | 34         | 31           |
| average time                                      | 7.8        | 18.3         | 5.3           | 23.6         | 3.8        | 10.4         | 21.1       | 24.0         |
| $\boxed{(4) \ GTZ = VCGen \ ; \ VCTransf \ ; Z3}$ |            |              |               |              |            |              |            |              |
| Gen function parameters                           | $H,I,\cap$ | $H,I,\equiv$ | $H,A,$ $\cap$ | $H,A,\equiv$ | $W,I,\cap$ | $W,I,\equiv$ | $W,A,\cap$ | $W,A,\equiv$ |
| verification precision                            | 67         | 75           | 78            | 75           | 76         | 72           | 80         | 67           |
| average time                                      | 16.8       | 22.0         | 8.3           | 26.3         | 3.8        | 7.7          | 20.2       | 16.1         |

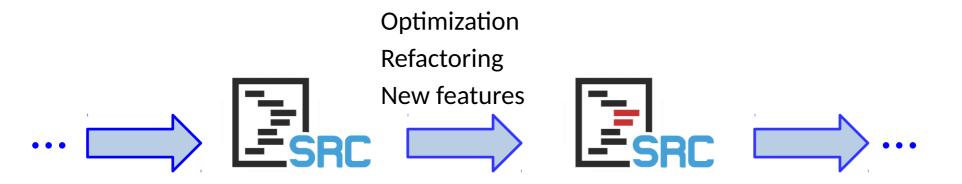
#### References

- [DFPP Fundamenta Informaticae 2017]
- http://map.uniroma2.it/smc/array-chr/

# Verification of relational properties

# **Relational Properties**

Stepwise program development



- Proving relations between fragments of program versions (e.g., equivalence) may be easier than proving the correctness of the new version from scratch.
- ... proving relations between executions of the same program with different input

# An Example

```
void sum_upto() {
                                     void prod() {
  z1=f(x1);
                                       z2 = g(x2, y2);
int f(int n1){
                                     int g(int n2, int m2){
  int r1:
                                       int r2;
  if (n1 \le 0) {
                                       r2=0:
    r1 = 0:
                                       while (n2 > 0) {
  } else {
                                         r2 += m2;
    r1 = f(n1 - 1) + n1;
                                         n2--:
 return r1;
                                       return r2;
       x1
z1 = \sum n1 = x1^*(x1+1)/2
                                        z2 = x2 * y2
      n1=0
```

(Non-tail) recursive

**Iterative** 

Relational property

if x1=x2 and x2≤y2 before execution of sum\_upto and prod and execution terminates, then z1≤z2

# Verification of Relational Properties

 State-of-the-art verification methods for relational properties are specific for the given programming language PL and class of properties RL [Benton 2004, Barthe et al. 2011, Felsing et al. 2014]

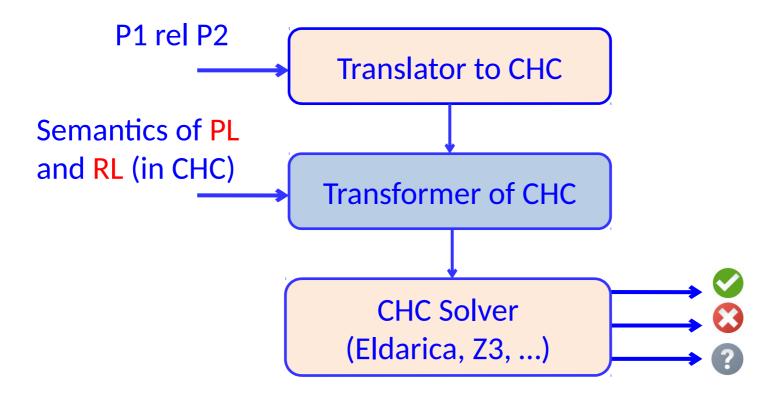
P1, P2: programs in programming language PL

rel: property in logic RL



# Verification through Horn Clause Transformation

CHC as a meta-language for programs, properties, and semantics.



Parametric w.r.t. PL and RL.

# Relational properties

Terminating computation

$$\langle P, env_0 \rangle \Downarrow env_h \quad iff \quad \langle I_0:c_0, env_0 \rangle \Rightarrow^* \langle I_h:halt, env_h \rangle$$

• Relational Property P1, P2 programs with disjoint variables,  $\varphi$ , $\psi$  constraints

$$\{\varphi\}$$
 P1 ~ P2  $\{\psi\}$ 

is valid iff for all disjoint environments env<sub>01</sub> and env<sub>02</sub>

$$if \models \phi[\text{env}_{01} \cup \text{env}_{02}], \quad \langle \text{P1}, \text{env}_{01} \rangle \Downarrow \text{env}_{h1}, \quad \langle \text{P2}, \text{env}_{02} \rangle \Downarrow \text{env}_{h2}$$

then 
$$\models \psi[env_{h1} \cup env_{h2}]$$

# Example, cont'd

```
void sum_upto() {
                                     void prod() {
  z1=f(x1);
                                       z2 = g(x2, y2);
                                     int g(int n2, int m2){
int f(int n1){
  int r1;
                                       int r2;
  if (n1 \le 0) {
                                       r2=0:
    r1 = 0:
                                       while (n2 > 0) {
  } else {
                                         r2 += m2;
    r1 = f(n1 - 1) + n1;
                                         n2--:
 return r1;
                                       return r2;
       x1
z1 = \sum n1 = x1^*(x1+1)/2
                                        z2 = x2 * y2
      n1=0
```

(Non-tail) recursive

**Iterative** 

```
Relational Property:

{x1=x2 ∧ x2≤y2} sum_upto ~ prod {z1≤z2}
```

# **Encoding the Transition Semantics in CHCs**

Reflexive-transitive closure ⇒\*:

```
reach(C,C) \leftarrow reach(C,C2) \leftarrow tr(C,C1), reach(C1,C2)
```

- Terminating computation ⟨P, env₀⟩ ↓ envh [input/output relation of P]:
   p(X,X') ← initConf(C,X), reach(C,C'), finalConf(C',X')
  - initConf(C,X): X is the value of the variables in the initial configuration C
  - finalConf(C',X'): X' is the value of the variables in the final configuration C'

# **Translating Relational Properties into CHCs**

•  $\{\phi\}$  P1 ~ P2  $\{\psi\}$ Prop: false  $\leftarrow$  pre(X,Y), p1(X,X'), p2(Y,Y'), neg\_post(X',Y')  $\phi$  P1 P2  $\neg \psi$ 

X,Y,X',Y': tuples of values for the variables of P1, P2, resp.

•  $T_{Prop}$  = {Prop} U {clauses for p1 and p2} Correctness of Translation: { $\phi$ } P1 ~ P2 { $\psi$ } is valid iff  $T_{Prop}$  is satisfiable

• Example: false ← X1=X2, X2≤Y2, Z1'>Z2',
sum\_upto(X1,Z1,X1',Z1'), prod(X2,Y2,Z2,X2',Y2',Z2')

# Example Cont'd: CHC Specialization

false ← X1=X2, X2≤Y2, Z1'>Z2', sum\_upto(X1,Z1,X1',Z1'), prod(X2,Y2,Z2,X2',Y2',Z2') + clauses for sum upto and prod **CHC Specializer** Specialized predicates false  $\leftarrow$  X1=X2, X2 $\leq$ Y2, Z1'>Z2', su(X1,Z1'), pr(X2,Y2,Z2')  $su(X,Z) \leftarrow f(X,Z)$  $f(N,Z) \leftarrow N \leq 0, Z=0$  $f(N,Z) \leftarrow N1, N1=N-1, Z=R+N, f(N1,R)$  $pr(X,Y,Z) \leftarrow W=0, g(X,Y,W,Z)$  $g(N,P,R,R) \leftarrow N \leq 0$  $g(N,P,R,R2) \leftarrow N1, N1=N-1, R1=P+R, g(N1,P,R1,R2)$ 

## Limitations of the Specialized CHCs

To show the satisfiability of

false 
$$\leftarrow$$
 c(X,Y), p1(X), p2(Y)  
a CHC solver looks for c1(X), c2(Y) such that in T<sub>SP</sub> U Th:  
p1(X)  $\rightarrow$  c1(X)  
p2(Y)  $\rightarrow$  c2(Y)  
c1(X), c2(Y), c(X,Y)  $\rightarrow$  false

To show the satisfiability of

false 
$$\leftarrow$$
 X1=X2, X2 $\leq$ Y2, Z1'>Z2', su(X1,Z1'), pr(X2,Y2,Z2')

a CHC solver has to show that:

$$su(X1,Z1') \rightarrow Z1' \le 1+ ... + X1$$
  
 $pr(X2,Y2,Z2') \rightarrow Z2' >= X2*Y2$   
 $Z1' \le 1+ ... + X1, Z2' >= X2*Y2, X1=X2, X2 \le Y2, Z1' > Z2' \rightarrow false$ 

Impossible for CHC solvers over LIA!
 Nonlinear constraints cannot be derived.

# Example Cont'd: Predicate Pairing

```
false \leftarrow X1=X2, X2\leqY2, Z1'>Z2',

su(X1,Z1'), pr(X2,Y2,Z2')

su(X,Z) \leftarrow f(X,Z)

f(N,Z) \leftarrow N \leq 0, Z=0

f(N,Z) \leftarrow N1, N1=N-1, Z=R+N, f(N1,R)

pr(X,Y,Z) \leftarrow W=0, g(X,Y,W,Z)

g(N,P,R,R) \leftarrow N \leq 0

g(N,P,R,R) \leftarrow N \leq 0
```

- $fg(N,Z1',Y,0,Z2') \rightarrow N>Y \vee Z1' \leq Z2'$  $(N>Y \vee Z1' \leq Z2') \wedge N \leq Y \wedge W=0 \wedge Z1'>Z2' \rightarrow false$
- Non-linear arithmetic relations not needed for proving satisfiability.
   CHC solvers over LIA (Eldarica, Z3) can prove satisfiability.

# Inferring Inter-Predicate Relations via **Predicate Pairing**

Introduce new predicates standing for conjunctions:



- Predicate pairing derives new clauses for conjunctions of predicates by unfold/fold transformations and preserves satisfiability.
- To prove satisfiability find constraint d(X,Y) such that:

$$p12(X,Y) \rightarrow d(X,Y)$$
  
  $d(X,Y), c(X,Y) \rightarrow false$ 

d(X,Y) captures relations between the variables of p1 and the variables of p2.

## Properties of the CHC transformation rules

CHC transformation rules preserve satisfiability
 [Tamaki-Sato 84,Etalle-Gabbrielli 96]

Theorem [DFPP 17]

Let **A** be a subset of the constraints of Th.

Let  $P \rightarrow ... \rightarrow Q$  be a transformation sequence

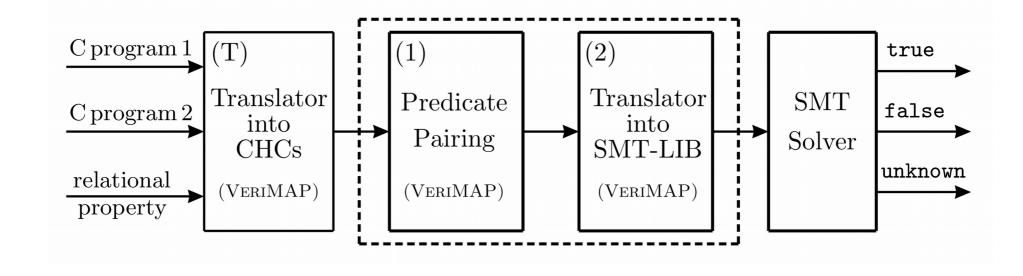
if P has an A-definable model then Q has an A-definable model

• Thus, CHC transformation rules preserve solvability (in abstract domains too).

Example: constraints over LIA.

A can be LIA or Octagons, difference constraints, ....

# Implementation in VeriMAP



# Short demo

### **Verification Problems**

#### Types of Verified Properties and Programs

- NLIN: nonlinear or nested recursion
   (e.g. some Ackermann variants, Sudan, McCarthy's 91, Dijkstra's fusc)
- MON: monotonicity
   if i1 >= i2 then o1 >= o2
- INJ: injectivityif i1 <> i2 then o1 <> o2
- FUN: functional dependency among variables
   if i1 = i2 then o1 = o2
- NINT: non-interference public output variables depend on public input variables only
- LOPT: loop and other compiler optimizations
   e.g. loop-unswitching, loop-fission, loop-fusion, loop-reversal, strength-reduction

### **Verification Problems**

#### Types of Verified Properties and Programs

- ITE: equivalence of two iterative programs on integers
- ARR: equivalence of two programs on arrays
- REC: equivalence of two recursive programs
- I-R: equivalence of an iterative and a (non-tail) recursive program
   e.g. greatest common divisor, n-th triangular number
- COMP: composition of different number of loops of integer and array progr.
- PCOR: partial correctness properties of an iterative program wrt a recursive functional postcondition

31 programs out of 163 are encoded using non-linear CHC

# **Experimental evaluation**

| Problem      | Problems |         | Z3 before PP |                      | Z3 after PP |        |
|--------------|----------|---------|--------------|----------------------|-------------|--------|
| Category     | P        | $ S_1 $ | $T_1$        | $\mid T_{\text{PP}}$ | $S_2$       | $T_2$  |
| (1) NLIN     | 13       | 4       | 16.11        | 25.80                | 13          | 13.12  |
| (2) MON      | 18       | 1       | 1.04         | 2.27                 | 12          | 3.72   |
| (3) INJ      | 11       | 0       | _            | 1.36                 | 8           | 1.39   |
| (4) FUN      | 7        | 4       | 1.39         | 1.24                 | 7           | 1.48   |
| (5) NINT     | 18       | 3       | 0.27         | 55.80                | 17          | 41.33  |
| (6) LOPT     | 20       | 2       | 4.83         | 2.98                 | 15          | 10.71  |
| (7) ITE      | 22       | 5       | 26.67        | 4.53                 | 18          | 17.01  |
| (8) ARR      | 6        | 1       | 7.45         | 2.04                 | 5           | 3.25   |
| (9) REC      | 15       | 6       | 2.89         | 1.50                 | 13          | 4.28   |
| (10) I-R     | 4        | 0       | _            | 0.65                 | 3           | 1.02   |
| (11) COMP    | 10       | 0       | _            | 16.35                | 7           | 6.46   |
| (12) PCOR    | 19       | 5       | 83.93        | 17.84                | 17          | 17.65  |
| Total number | 163      | 31      | 144.58       | 132.36               | 135         | 121.42 |
| Average Time |          |         | 4.66         | 0.81                 |             | 0.90   |

- Timeout: 300 seconds
- No timeout occurred during the application of the PP strategy.
- CHC size increase due to PP but no performance degradation

#### Comments

Our method for relational verification:

```
Translation to CHCs;
Satisfiability-Preserving Transformations of CHCs;
CHC Solving
```

- Parametric wrt programming language
- Fully automatic and effective on small-sized programs

#### **Future work**

Proving relations across programming languages to validate program translation/compilation

#### References

- [DFPP SAS 16] [DFPP TPLP 17]
- http://map.uniroma2.it/relprop/

# Verification of programs with inductively-defined data structures

## Verification of functional programs

- OCaml: A statically typed, functional, higher-order, OO language
- Computing the sum and the maximum of the absolute values of the elements of a list:

(Relational) Property: ∀I. listsum(I) >= listmax(I)

#### Translation into CHCs

The OCaml program is translated into CHCs:

```
\begin{split} & \text{listsum}([],S) \leftarrow \text{S=0} \\ & \text{listsum}([X|Xs],S) \leftarrow \text{S=S1+A}, \, \text{abs}(X,A), \, \text{listsum}(Xs,S1) \\ & \text{listmax}([],M) \leftarrow \text{M=0} \\ & \text{listmax}([X|Xs],M) \leftarrow \text{abs}(X,A), \, \text{max}(A,M1,M), \, \text{listmax}(Xs,M1) \\ & \text{abs}(X,A) \leftarrow (X>=0, \, A=X) \, \, \textbf{v} \, \, (X<0, \, A=-X) \\ & \text{max}(A,M1,M) \leftarrow (A>=M1, \, M=A) \, \, \textbf{v} \, \, (A<M1, \, M=M1) \end{split}
```

The property is translated into a CHC query:

```
false \leftarrow S<M, sum(L,S), max(L,M)
```

 The clauses are satisfiable but CHC solvers do not solve them because models are infinite formulas in the quantifier-free theory of integer lists:

```
listsum(L,S) \mapsto (L=[], S=0) \mathbf{v} (L=[X], abs(X,S)) \mathbf{v} (L=[X,Y], abs(X,A), abs(Y,B), S=A+B) \mathbf{v} ... listmax(L,M) \mapsto (L=[], M=0) \mathbf{v} (L=[X], abs(X,M)) \mathbf{v} ...
```

# Solving CHCs on inductively defined data types by induction

- Solution 1: Extending CHC solving with induction.
- Proof of satisfiability, by induction on list L:

 $\forall L,S,M.$  listsum(L,S), listmax(L,M)  $\rightarrow$  S>=M

and hence listsum(L,S), listmax(L,M), S<M  $\rightarrow$  false

- Reynolds-Kuncak: Induction for SMT solvers, VMCAI 2015.
- Unno-Torii-Sakamoto: Automating induction for solving Horn clauses, CAV 2017.

# Solving CHCs on inductively defined data types by CHC transformation

 Solution 2 (this work): Transform CHCs on inductive data types into equisatisfiable CHCs without inductive data types (e.g., on integers or booleans):

```
list-sum-max(S,M) \leftarrow S=0, M=0
list-sum-max(S,M) \leftarrow S=S1+A, abs(X,A), max(A,M1,M), list-sum-max(S1,M1)
false \leftarrow S<M, list-sum-max(S,M)
```

Solved by Z3, without induction.

Solution: list-sum-max(S,M)  $\mapsto$  S>=M, M>=0

No infinite models are needed to show satisfiabilty

## Eliminating inductive data structures

- Transformations for eliminating inductive data structures: Deforestation [Wadler '88],
   Unnecessary Variable Elimination by Unfold/Fold [PP '91], Conjunctive Partial Deduction [De Schreye et al. '99]
- Define a new predicate:
   list-sum-max(S,M) ← listsum(L,S), listmax(L,M)
- Unfold:

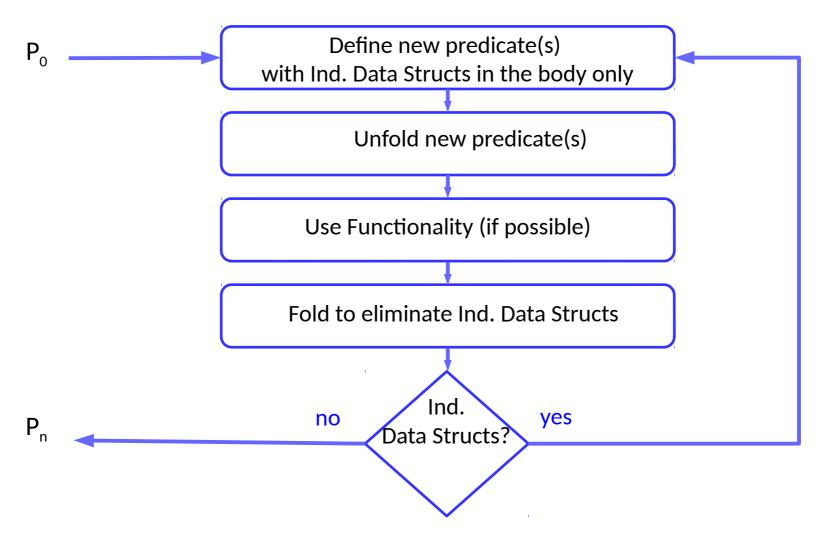
```
list-sum-max(S,M) ← S=0, M=0
list-sum-max(S,M) ← S=S1+A, abs(X,A), max(A,M1,M),
listsum(Xs,S1), listmax(Xs,M1)
```

Fold (eliminate lists):

```
list-sum-max(S,M) ← S=0, M=0
list-sum-max(S,M) ← S=S1+A, abs(X,A), max(A,M1,M),
list-sum-max(S1,M1)
```

false  $\leftarrow$  S<M, list-sum-max(S,M)

## The Elimination Algorithm *EC*



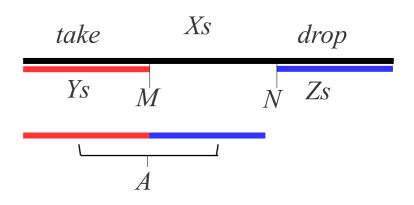
#### **Termination**

- Algorithm E terminates if
  - the query has no sharing cycles
  - the other clauses have a disjoint, quasi-descending slice decomposition

```
\begin{split} \min(X,Y,Z) \leftarrow X < Y, \ Z = X \\ \min(X,Y,Z) \leftarrow X \ge Y, \ Z = Y \\ \min_{leaf}(leaf,M) \leftarrow M = 0 \\ \min_{leaf}(node(X,L,R),M) \leftarrow M = M3 + 1, \ \min_{leaf}(L,M1), \ \min_{leaf}(R,M2), \\ \min(M1,M2,M3) \\ left_{leaf}(node(X,L,R),node(X,L,R)) \leftarrow N \le 0 \\ left_{leaf}(node(X,L,R),node(X,L,R)) \leftarrow N \ge 1, \ N1 = N - 1, \ left_{leaf}(node(X,L,R)) \\ left_{leaf}(node(X,L,R),T) \leftarrow N \ge 1, \ N1 = N - 1, \ left_{leaf}(node(X,L,R)) \\ left_{leaf}(node(X,L,R),T) \leftarrow N \ge 1, \ N1 = N - 1, \ left_{leaf}(node(X,L,R),T) \\ left_{leaf}(node(X,L,R),T) \leftarrow N \ge 1, \ N1 = N - 1, \ left_{leaf}(node(X,L,R),T) \\ left_{leaf}(node(X,L,R),T) \leftarrow N \ge 1, \ N1 = N - 1, \ left_{leaf}(node(X,L,R),T) \\ left_{leaf}(node(X,L,R),T) \leftarrow N \ge 1, \ N1 = N - 1, \ left_{leaf}(node(X,L,R),T) \\ left_{leaf}(node(X,L,R),T) \leftarrow N \ge 1, \ N1 = N - 1, \ left_{leaf}(node(X,L,R),T) \\ left_{leaf}(node(X,L,R),T) \leftarrow N \ge 1, \ N1 = N - 1, \ left_{leaf}(node(X,L,R),T) \\ left_{leaf}(node(X,L,R),T) \leftarrow N \ge 1, \ N1 = N - 1, \ left_{leaf}(node(X,L,R),T) \\ left_{leaf}(node(X,L,R),T) \leftarrow N \ge 1, \ N1 = N - 1, \ left_{leaf}(node(X,L,R),T) \\ left_{leaf}(node(X,L,R),T) \leftarrow N \ge 1, \ N1 = N - 1, \ left_{leaf}(node(X,L,R),T) \\ left_{leaf}(node(X,L,R),T) \leftarrow N \ge 1, \ N1 = N - 1, \ left_{leaf}(node(X,L,R),T) \\ left_{leaf}(node(X,L,R),T) \leftarrow N \ge 1, \ N1 = N - 1, \ left_{leaf}(node(X,L,R),T) \\ left_{leaf}(node(X,L,R),T) \leftarrow N \ge 1, \ N1 = N - 1, \ left_{leaf}(node(X,L,R),T) \\ left_{leaf}(node(X,L,R),T) \leftarrow N \ge 1, \ N1 = N - 1, \ left_{leaf}(node(X,L,R),T) \\ left_{leaf}(node(X,L,R),T) \leftarrow N \ge 1, \ N1 = N - 1, \ left_{leaf}(node(X,L,R),T) \\ left_{leaf}(node(X,L,R),T) \leftarrow N \ge 1, \ N1 = N - 1, \ left_{leaf}(node(X,L,R),T) \\ left_{leaf}(node(X,L,R),T) \leftarrow N \ge 1, \ N1 = N - 1, \ left_{leaf}(node(X,L,R),T) \\ left_{leaf}(node(X,L,R),T) \leftarrow N \ge 1, \ N1 = N - 1, \ left_{leaf}(node(X,L,R),T) \\ left_{leaf}(node(X,L,R),T) \leftarrow N \ge 1, \ N1 = N - 1, \ left_{leaf}(node(X,L,R),T) \\ left_{leaf}(node(X,L,R),T) \leftarrow N \ge 1, \ N1 = N - 1, \ left_{leaf}(node(X,L,R),T) \\ left_{leaf}(node(X,L,R),T) \leftarrow N \ge 1, \ N1 = N - 1, \ left_{leaf}(node(X,L,R),T) \\ left_{leaf}(node(X,L,R),T) \leftarrow N \ge 1
```

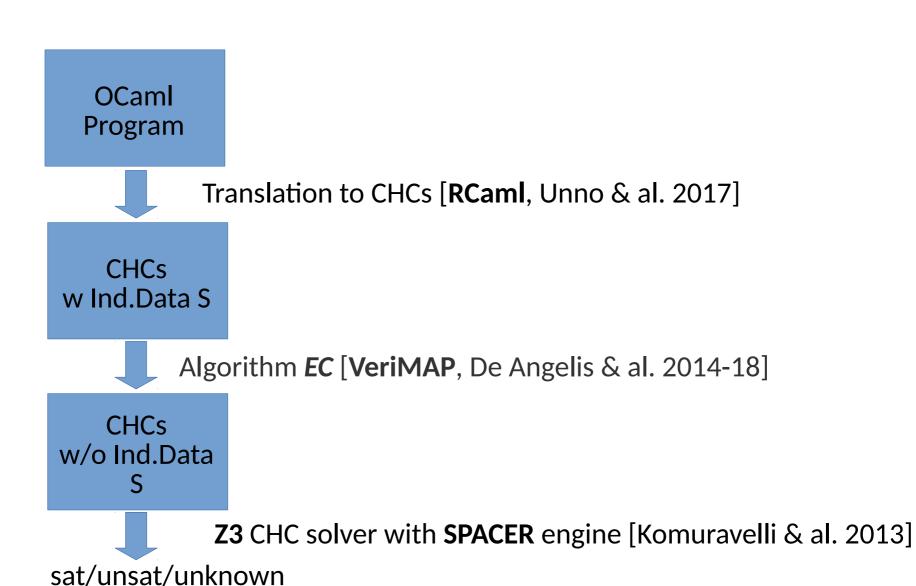
## A nonterminating transformation

• A property of lists if M=N then A=Xs



$$\begin{array}{lll} append([\ ],Ys,Ys) \leftarrow & take(N,[\ ],[\ ]) \leftarrow \\ append([X|Xs],Ys,[Z|Zs]) \leftarrow X = Z, & take(N,[X|Xs],[\ ]) \leftarrow N = 0 \\ append(Xs,Ys,Zs) & take(N,[X|Xs],[Y|Ys]) \leftarrow N \neq 0, \ X = Y, \\ & N1 = N - 1, \ take(N1,Xs,Ys) \\ drop(N,[\ ],[\ ]) \leftarrow & diff\_list([\ ],[Y|Ys]) \leftarrow \\ drop(N,[X|Xs],[Y|Xs]) \leftarrow N = 0, X = Y & diff\_list([X|Xs],[\ ]) \leftarrow \\ drop(N,[X|Xs],Ys) \leftarrow N \neq 0, N1 = N - 1, & diff\_list([X|Xs],[Y|Ys]) \leftarrow X \neq Y \\ drop(N1,Xs,Ys) & diff\_list([X|Xs],[Y|Ys]) \leftarrow X = Y, \\ drop(N1,Xs,Ys) & diff\_list(Xs,Ys) \\ false \leftarrow M = N, \ take(M,Xs,Ys), drop(N,Xs,Zs), append(Ys,Zs,A), diff\_list(A,Xs) \\ \end{array}$$

#### **Verification of OCaml Programs**



## **Experimental evaluation**

#### Benchmark:

- 70 OCaml small (but non-trivial) programs on lists/trees from RCaml and IsaPlanner (a proof planner for ISABELLE)
- 35 more OCaml programs (e.g., binary search trees)

|                             |             |      | Z                 | Z3          |                                | $\mathcal{EC}; \mathbf{Z3}$    |                   | RCAML          |  |
|-----------------------------|-------------|------|-------------------|-------------|--------------------------------|--------------------------------|-------------------|----------------|--|
| Pro                         | blem Set    | n    | $S_{\mathrm{Z}3}$ | $T_{ m Z3}$ | $S_{\mathcal{EC};\mathrm{Z3}}$ | $T_{\mathcal{EC};\mathrm{Z3}}$ | $S_{ m RC_{AML}}$ | $T_{ m RCaml}$ |  |
| (1) FirstOrder 57           |             | 57   | 3                 | 0.09        | 47                             | 37.64                          | 41                | 216.59         |  |
| (2) HigherOrderInstances 13 |             | s 13 | 1                 | 0.04        | 11                             | 8.33                           | 10                | 45.40          |  |
| (3) MoreLists 1             |             | 16   | 3                 | 13.87       | 14                             | 11.27                          | 10                | 119.01         |  |
| (4) More Trees 19           |             | 19   | 5                 | 20.18       | 19                             | 26.79                          | 5                 | 55.16          |  |
|                             | Total       | 105  | 12                | 34.18       | 91                             | 84.03                          | 66                | 436.17         |  |
|                             | $Avg\ time$ |      |                   | 2.85        |                                | 0.92                           |                   | 6.61           |  |

#### **Comments**

- Transformation is a viable alternative to induction to solve CHCs on data structures
- We presented transformation algorithms which are effective on small, non-trivial examples

#### **Future work**

- Higher-order functional programs
- Discover and apply lemmata to eliminate inductive data structures

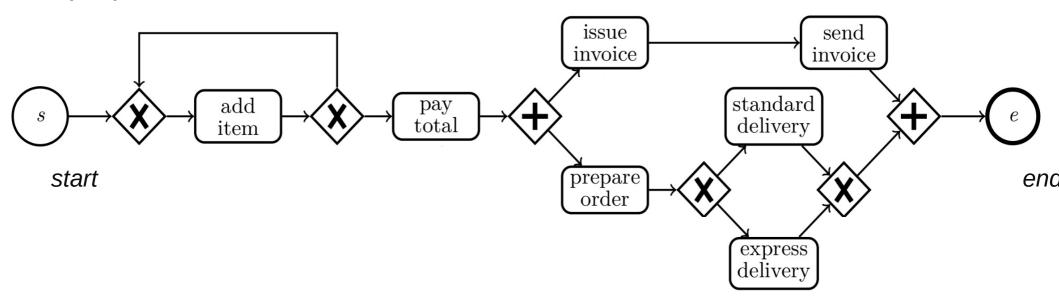
#### References

- [DFPP TPLP 18]
- https://fmlab.unich.it/iclp2018/

# Verification of time-aware business processes

#### **Business Processes**

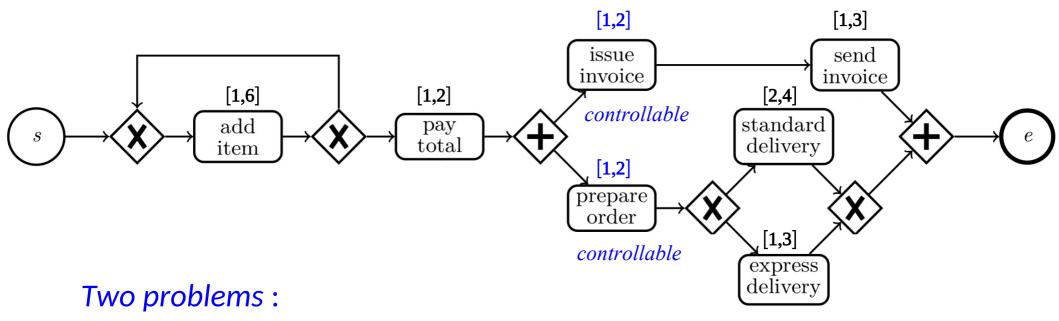
- Business processes are 'graphs' for coordinating the activities of an organization towards a business goal.
- An example: Purchase Order. A customer adds items to the shopping cart and pays. Then, the vendor issues and sends the invoice, and in parallel, prepares and delivers the order.



There is no information on the durations of tasks.

#### **Time-Aware Business Processes**

• Information on the duration: Intervals:  $d \in [dmin, dmax] \subset \mathbb{N}$ 



- Time-Reachability: checking whether or not to go from s to e takes less than k units of time.
- Controllability: finding the durations of some controllable tasks so that a given time-reachability property holds.

## Business Process Modeling and Notation (BPMN)

Graphical notation for modeling organizational processes.

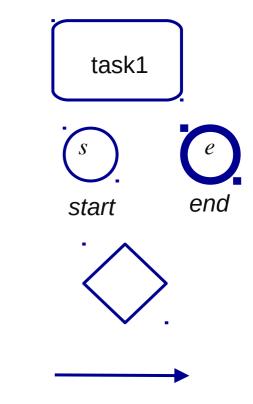
BPMN is a standard.

• Tasks : atomic activities

•Events: something that happens

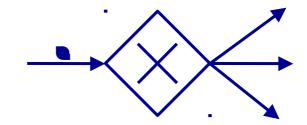
•Gateways: either branching or merging

•Flows: order of execution (drawn as arrows)

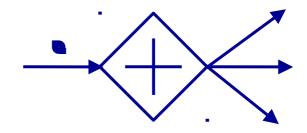


# **Branch Gateways**

- single incoming flow, multiple outgoing flows
- exclusive branch gateway (XOR)
  - upon activation of the incoming flow exactly one outgoing flow is activated

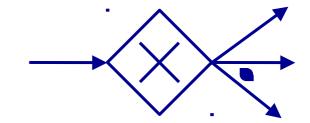


- parallel branch gateway (AND)
  - upon activation of the incoming flow all outgoing flows are activated

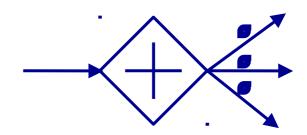


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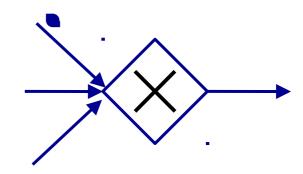


- parallel branch gateway (AND)
  - upon activation of the incoming flow all outgoing flows are activated

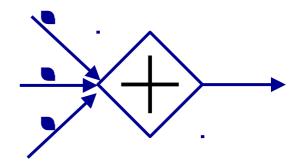


# Merge Gateways

- multiple incoming flows, single outgoing flow
- exclusive merge gateway (XOR)
  - the outgoing flow is activated upon activation of one of the incoming flows

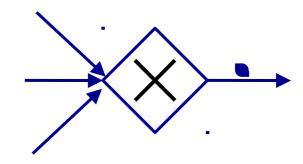


- parallel merge gateway (AND)
  - the outgoing flow is activated upon activation
     of *all* the incoming flows

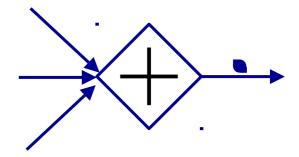


# Merge Gateways

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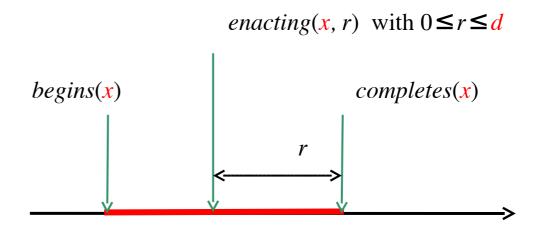
- parallel merge gateway (AND)
  - the outgoing flow is activated upon activation
     of *all* the incoming flows



- Transition relation between states:  $\langle F,t \rangle \rightarrow \langle F',t' \rangle$
- F: a set of *fluents* (i.e., a set of properties that hold at time point t)
  - begins(x) x begins its execution (enactment)
  - enacting(x,r) x is executing with r residual time to completion
  - completes(x) x completes its execution
  - enables(x,y) x enables its successor y
    - x, y denote either tasks, or events, or gateways
- seq(x,y) there is an arrow from x to y
- t: time point (i.e., a non-negative integer)
  - duration(x,d) the duration of x is d

 $task(x) \leftarrow$   $duration(x, d) \leftarrow 3 \le d \le 4$ 





- durations of events and gateways are assumed to be 0

Instantaneous transition:

$$\langle F,t \rangle \rightarrow \langle F',t \rangle$$

$$begins(x)$$
  $\longrightarrow$   $enacting(x,d)$ 

$$(S_1) \quad \frac{begins(x) \in F \quad duration(x, d)}{\langle F, t \rangle \longrightarrow \langle (F \setminus \{begins(x)\}) \cup \{enacting(x, d)\}, \ t \rangle}$$

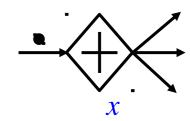
Instantaneous transitions:

$$\langle F, t \rangle \rightarrow \langle F', t \rangle$$

$$(S_2) \quad \frac{completes(x) \in F \quad par\_branch(x)}{\langle F, t \rangle \longrightarrow \langle (F \setminus \{completes(x)\}) \cup \{enables(x, s) \mid seq(x, s)\}, \ t \rangle}$$

$$(S_3) \quad \frac{completes(x) \in F \quad not\_par\_branch(x) \quad seq(x, s)}{\langle F, t \rangle \longrightarrow \langle (F \setminus \{completes(x)\}) \cup \{enables(x, s)\}, \ t \rangle}$$

(S<sub>2</sub>) If the parallel branch x completes, then all its successors S are enabled, istantaneously



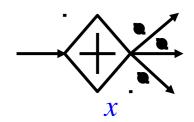
Instantaneous transitions:

$$\langle F, t \rangle \rightarrow \langle F', t \rangle$$

$$(S_{2}) \quad \frac{completes(x) \in F \quad par\_branch(x)}{\langle F, t \rangle \longrightarrow \langle (F \setminus \{completes(x)\}) \cup \{enables(x, s) \mid seq(x, s)\}, \ t \rangle}$$

$$(S_{3}) \quad \frac{completes(x) \in F \quad not\_par\_branch(x) \quad seq(x, s)}{\langle F, t \rangle \longrightarrow \langle (F \setminus \{completes(x)\}) \cup \{enables(x, s)\}, \ t \rangle}$$

 $(S_2)$  If the parallel branch x completes, then all its successors S are enabled, istantaneously



The time-elapsing transition:

$$\langle F,t \rangle \rightarrow \langle F',t' \rangle$$

$$(S_7) \quad \frac{no\_other\_premises(F)}{\langle F, t \rangle \longrightarrow \langle F \ominus m \setminus Enbls, \ t+m \rangle} \quad m > 0$$

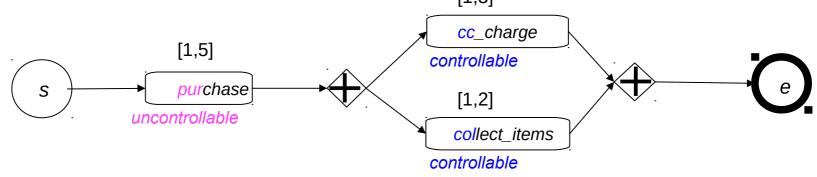
where: (i)  $no\_other\_premises(F)$  holds iff none of the premises of rules  $S_1-S_6$  holds, (ii)  $m=min\{r \mid enacting(x,r) \in F\}$ , (iii)  $F \ominus m$  is the set F of fluents where every enacting(x,r) is replaced by enacting(x,r-m), and (iv)  $Enbls = \{enables(p,s) \mid enables(p,s) \in F\}$ .

Time elapses when no istantaneous transition can occur.

All enacting tasks proceed in parallel for a time equal to the minimum of all residual times.

# Weak Controllability

- Assume:
  - some tasks are *controllable* (e.g., internal to the organization)
  - some tasks are *uncontrollable* (e.g., external to the organization)
- Weak Controllabilty: For all durations of the uncontrollable tasks (within the given time intervals), we can determine durations of the controllable tasks (within the given time intervals), s.t. a state can be reached and a given time constraint is satisfied.



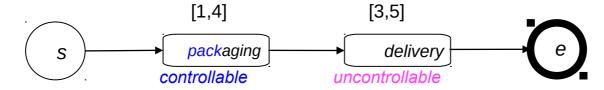
constraint:  $3 \le T_{total} \le 7$ 

a solution: if  $D_{pur}=1$  then  $D_{cc}=D_{col}=2$  else  $D_{cc}=D_{col}=1$ 

# **Strong Controllability**

Weak Controllability may not be useful when some uncontrollable tasks occur *after* controllable ones.

- Strong Controllability: We can determine durations of the controllable tasks (within the given time intervals) s.t., for all durations of the uncontrollable tasks (within the given time intervals), a state can be reached and a given time constraint is satisfied.
- •The exact duration of the delivery is not known when packaging.



constraint:  $4 \le T_{total} \le 7$ a solution:  $1 \le D_{pack} \le 2$ 

#### **CHC** translation

Instantaneous transition:

$$\langle F,t \rangle \rightarrow \langle F',t \rangle$$

$$begins(x)$$
  $\longrightarrow$   $enacting(x,d)$ 

$$(S_1) \quad \frac{begins(x) \in F \quad duration(x, d)}{\langle F, t \rangle \longrightarrow \langle (F \setminus \{begins(x)\}) \cup \{enacting(x, d)\}, \ t \rangle}$$



$$C1. \ tr(s(F,T),s(FU,T),U,C) \leftarrow select(\{begins(X)\},F), \ task\_duration(X,D,U,C), \\ update(F,\{begins(X)\},\{enacting(X,D)\},FU)$$

where U, C are tuples of uncontrollable and controllable durations, resp.

## CHC interpreter of time-aware BPMN

```
C1. tr(s(F,T), s(FU,T), U, C) \leftarrow select(\{begins(X)\}, F), task\_duration(X, D, U, C),
      update(F, \{begins(X)\}, \{enacting(X, D)\}, FU)
C2. tr(s(F,T),s(FU,T),U,C) \leftarrow select(\{completes(X)\},F), par\_branch(X),
      findall(enables(X, S), (seq(X, S)), Enbls), update(F, \{completes(X)\}, Enbls, FU))
C3. tr(s(F,T), s(FU,T), U, C) \leftarrow select(\{completes(X)\}, F), not\_par\_branch(X), seq(X,S),
      update(F, \{completes(X)\}, \{enables(X, S)\}, FU)
C4. tr(s(F,T), s(FU,T), U, C) \leftarrow select(Enbls, F), par\_merge(X),
      findall(enables(P,X),(seq(P,X)),Enbls),\ update(F,Enbls,\{begins(X)\},FU)
C5. tr(s(F,T),s(FU,T),U,C) \leftarrow select(\{enables(P,X)\},F), not\_par\_merge(X),
       update(F, \{enables(P, X)\}, \{begins(X)\}, FU)
C6. tr(s(F,T), s(FU,T), U, C) \leftarrow select(\{enacting(X,R)\}, F), R=0,
      update(F, \{enacting(X, R)\}, \{completes(X)\}, FU)
C7. tr(s(F,T), s(FU,TU), U, C) \leftarrow no\_other\_premises(F), member(enacting(\_, \_), F),
      findall(Y, (Y = enacting(X, R), member(Y, F)), Enacts),
       mintime(Enacts, M), M > 0, decrease\_residual\_times(Enacts, M, EnactsU),
      findall(Z, (Z = enables(P, S), member(Z, F)), Enbls),
      set\_union(Enacts, Enbls, EnactsEnbls), update(F, EnactsEnbls, EnactsU, FU),
```

TU = T + M

## **CHC** translation

reach: reflexive, transitive closure of the transition relation tr

R1:  $reach(S,S,U,C) \leftarrow$ 

R2:  $reach(S0,S2,U,C) \leftarrow tr(S0,S1,U,C)$ , reach(S1,S2,U,C)

# **Encoding Reachability**

Reachability Property.

```
RP: reachProp(U,C) \leftarrow c(T,U,C), reach(init,fin(T),U,C) where c(T,U,C) is a constraint
```

- Initial state. init: < {begins(start)}, 0 >
- Final state. fin(T): < {completes(end)}, T >

# **Encoding Controllability**

Let Sem be the CHC encoding of semantics: C1-C7 (for tr) and R1-R2 (for reach). Let LIA be the theory of Linear Integer Arithmetics.

Weak Controllability

Sem 
$$\cup$$
 {RP} U LIA  $\models$   $\forall U$ . adm( $\cup$ )  $\rightarrow$   $\exists C$  reachProp( $\cup$ , $C$ )

where adm(U) iff the durations in U belong to the given intervals

Strong Controllability

$$Sem \cup \{RP\} \cup LIA \models \exists C. \forall U. adm(U) \rightarrow reachProp(U,C)$$

# Verifying controllability

- Validity of Weak and Strong Controllabilities:
  - cannot be proved by CHC solvers over LIA (e.g., Z3), because of the complex terms (such as those denoting sets) and the *findall* predicate in *Sem*
  - cannot be proved by CLP systems, because of  $\exists -\forall$  and  $\forall -\exists$
  - solvers and CLP systems have termination problems due to recursive reach.
- We developed special purpose algorithms for solving weak and strong controllability.
  - Reduce solving of  $\exists -\forall$  and  $\forall -\exists$  with recursive clauses to
    - computing answers to queries
    - solving a set of quantified LIA contraints

## **Experimental evaluation**

#### Different tools have been used:

- VeriMAP for generating CHC
- SICStus Prolog: Computation of answer constraints
- **Z3**: SMT solver for checking quantified *LIA* formulas

#### Experimentation on various examples:

- Purchase order [DFMPP 2016]
- Request Day-Off Approval [Huai et al. 2010]
- STEMI: Emergency Department Admission [Combi et al. 2009]
- STEMI: Emergency Department + Coronary Care Unit Admission [Combi et al. 2012]

#### **Comments**

Controllability was introduced in various contexts
 [Vidal-Fargier 1999, Combi-Posenato 2009, Cimatti et al. 2015,
 Zavatteri et al. 2017]

#### Future work

Larger fragment of BPMN: timers, interrupting events, ...

Data [Montali et al. 2013, Deutsch 2014, ...]

Ontologies for tasks, ...

#### References

- [DFMPP LOPSTR 16] [DFMPP RuleML+RR 17]
- http://map.uniroma2.it/lopstr16/

## Final comments

- We presented a flexible framework for CHC verification
  - parametric with respect to the semantics and the property
  - use of satisfiability-preserving and solvability-preserving
     CHC transformations
  - can improve precision state-of-the-art CHC solvers
- Future work
  - Make it more usable (better interface, web interface)
  - Make it more extensible (define API, hooks, ...)
  - Integrate external libraries and tools
- You are welcome to use it for your verification tasks.
  - We would be happy to help you!

## Thank you

### **Encoding the Operational Semantics**

```
function call
                   x=f(e1,...,en);
                                                "return" case
    tr(cf(cmd(L,asgn(X,call(F,Es))), (D,S)),
                                                 source configuration
      cf(cmd(L2,C2),
                               (D2.S2)))
                                                 target configuration
       eval_list(Es,D,S,Vs),
                                    evaluate function parameters
       build_funenv(F,Vs,FEnv),
                                         build function environment
       firstlab(F,FL), at(FL,C),
                                         first label and command function def
       reach(cf(cmd(FL,C), (D,FEnv)),
                                              function execution
             cf(cmd(LR,return(E)),(D1,S1))),
                                              return
       eval(E,(D1,S1),V),
                                         evaluate returned expression
       update((D1,S),X,V,(D2,S2)),
                                         update caller environment
       nextlab(L,L2), at(L2,C2)
                                         next label and command
```

## VCs Multi-Step Semantics

```
false \leftarrow X > = 1, Y > = 1, X1 = < -1, new3(X, Y, X1, Y1)
new3(X,Y, X1,Y1) \leftarrow X+1=<Y, new4(X,Y, X1,Y1)
                                                          loop execution
new3(X,Y, X1,Y1) \leftarrow X >= Y+1, new4(X,Y, X1,Y1)
                                                           loop execution
new3(X,Y, X,Y) \leftarrow X=Y
                                                            loop exit
new4(X,Y, X3,Y3) \leftarrow X >= Y+1, A=X, B=Y, X2=R1,
                                                           then branch
                     new6(X,Y,A,B,R, X1,Y1,A1,B1,R1),
                     new3(X2,Y1, X3,Y3)
new4(X,Y, X3,Y3) \leftarrow X = < Y, A = Y, B = X, Y2 = R1,
                                                           else branch
                      new6(X,Y,A,B,R, X1,Y1,A1,B1,R1),
                      new3(X1,Y2, X3,Y3)
new6(X,Y,A,B,R, X,Y,A,B,R1) \leftarrow R1=A-B
                                                          sub function call
```

#### VCs generated by using the multi-step semantics

- Non linear recursive: multiple atoms in the body
- Predicate arity is even (variables for source and target configurations)

### **Small-Step Semantics**

- Keep a stack of activation frames
- **Function call**: push an element on top of the stack

```
tr(cf(cmd(L,asgn(X,call(F,Es))),D,T),
                                 D,[frame(L1,X,Fenv)|T])) \leftarrow
    cf(cmd(FL,C),
           nextlab(L,L1),
           loc_env(T,S), eval_list(Es,D,S,Vs),
           build_funenv(F,Vs,FEnv),
           firstlab(F,FL), at(FL,C).
L1
        label where to jump after returning
        value returned by the function call
       local environment used during the execution of the function call
FEnv
```

Function return: pop an element from the stack

```
tr(cf(cmd(L,return(E)),D, [frame(L1,X,S) |T]),
  cf(cmd(L1,C),
                D1.T1))
        eval(E,D,S,V),
        update((D,T),X,V,(D1,T1)),
        at(L1,C).
```

X

### **Small-Step Semantics**

Encoding correctness when using the Small-Step semantics

```
false \leftarrow initConf(C), reach(C).
reach(C) \leftarrow tr(C,C1), reach(C1).
reach(C) \leftarrow finalConf(C).
```

VCs generated by using the Small-Step semantics

```
\begin{array}{lll} \text{false} \leftarrow \text{X>=1, Y>=1, new3(X,Y)}. & \text{new6(X,Y)} \leftarrow \text{A=X, B=Y, new11(X,Y,A,B,R)}. \\ \text{new3(X,Y)} \leftarrow \text{X=<-1, Y=X}. & \text{new7(X,Y)} \leftarrow \text{A=Y, B=X, new8(X,Y,A,B,R)}. \\ \text{new3(X,Y)} \leftarrow \text{X+1=<Y, new4(X,Y)}. & \text{new8(X,Y,A,B,R)} \leftarrow \text{R1=A-B, new9(X,Y,A,B,R1)}. \\ \text{new4(X,Y)} \leftarrow \text{X>=1+Y, new4(X,Y)}. & \text{new9(X,Y,A,B,R)} \leftarrow \text{Y1=R, new3(X,Y1)}. \\ \text{new4(X,Y)} \leftarrow \text{X>=Y+1, new6(X,Y)}. & \text{new11(X,Y,A,B,R)} \leftarrow \text{R1=A-B, new12(X,Y,A,B,R1)}. \\ \text{new4(X,Y)} \leftarrow \text{X=<Y, new7(X,Y)}. & \text{new12(X,Y,A,B,R)} \leftarrow \text{X1=R, new3(X1,Y)}. \\ \end{array}
```

- Linear recursive (at most one atom in the body)
- More predicates and clauses than in Multi-Step semantics VCs Multiple predicates for the calls to the <u>sub</u> function (e.g. new11 and new8)
- Half the variables w.r.t. MS semantics VCs

#### Termination: No sharing cycles

- Algorithm E terminates if
  - the query has no sharing cycles
  - the other clauses have a disjoint, quasi-descending slice decomposition

No multiple occurrences of the same variable in each atom (wlog)

labeled (multi)graph: the nodes are the atoms of the query and there is an edge between two atoms, labeled by variable X, iff they share X sharing cycle: path from an atom to itself labeled by distinct variables

T

false  $\leftarrow N \ge 0$ , M+N < K,  $left\_drop(N, \blacksquare, N)$ ,  $min\_leaf(\blacksquare, M)$ ,  $min\_leaf(\blacksquare, K)$ 

### **Termination: Quasi-descending**

- Algorithm E terminates if
  - the query has no sharing cycles
  - the other clauses have a disjoint, quasi-descending slice decomposition

```
\begin{aligned} & \min(X,Y,Z) \leftarrow X < Y, \ Z = X \\ & \min(X,Y,Z) \leftarrow X \ge Y, \ Z = Y \\ & \min\_leaf(leaf,M) \leftarrow M = 0 \end{aligned}
```

Slice: take one "inductive" argument for each predicate

Quasi-descending: body arguments are (possibly non-strict) subterms of head arguments

 $min\_leaf(\underbrace{node(X,L,R)},M) \leftarrow M = M3+1, \ min\_leaf(\underbrace{L},M1), \ min\_leaf(\underbrace{R},M2), \ min(M1,M2,M3)$ 

 $\begin{aligned} & left\_drop(N, leaf, leaf) \leftarrow \\ & left\_drop(N, node(X, L, R), node(X, L, R)) \leftarrow N \leq 0 \\ & left\_drop(N, \underbrace{node(X, L, R), T}) \leftarrow N \geq 1, \ N1 = N - 1, \ left\_drop(N1, \underbrace{L, T}) \end{aligned}$ 

 $false \leftarrow N \geq 0, \ M+N < K, \ left\_drop(N,T,U), \ min\_leaf(U,M), \ min\_leaf(T,K)$ 

#### Termination: Disjoint slices

- Algorithm E terminates if
  - the query has no sharing cycles
  - the other clauses have a disjoint, quasi-descending slice decomposition

```
\begin{array}{l} \min(X,Y,Z) \leftarrow X < Y, \ Z = X \\ \min(X,Y,Z) \leftarrow X \geq Y, \ Z = Y \\ \min(Leaf(leaf,M) \leftarrow M = 0 \end{array} slices of
```

Disjoint: no variable is shared between two slices of the same clause

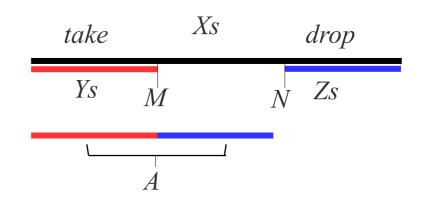
 $min\_leaf(\underbrace{node(X,L,R)},M) \leftarrow M = M3+1, \ min\_leaf(\underbrace{L},M1), \ min\_leaf(\underbrace{R},M2), \ min(M1,M2,M3)$ 

```
\begin{aligned} & left\_drop(N, leaf, leaf) \leftarrow \\ & left\_drop(N, node(X, L, R), node(X, L, R)) \leftarrow N \leq 0 \\ & left\_drop(N, \underbrace{node(X, L, R), T}) \leftarrow N \geq 1, \ N1 = N - 1, \ left\_drop(N1, \underbrace{L, T}) \end{aligned}
```

 $false \leftarrow N \ge 0, M+N < K, left\_drop(N,T,U), min\_leaf(U,M), min\_leaf(T,K)$ 

#### A nonterminating transformation

• A property of lists if M=N then A=Xs



```
append([\ ],Ys,Ys) \leftarrow \\ append([X|Xs],Ys,[Z|Zs]) \leftarrow X = Z, \\ append(Xs,Ys,Zs) \\ take(N,[X|Xs],[Y|Ys]) \leftarrow N \neq 0, X = Y, \\ N1 = N-1, \ take(N1,Xs,Ys) \\ drop(N,[\ ],[\ ]) \leftarrow \\ drop(N,[X|Xs],[Y|Xs]) \leftarrow N \neq 0, X = Y, \\ drop(N,[X|Xs],Ys) \leftarrow N \neq 0, X = Y, \\ drop(N,[X|Xs],Ys) \leftarrow N \neq 0, X = Y, \\ drop(N,[X|Xs],Ys) \leftarrow N \neq 0, X = Y, \\ drop(N,[X|Xs],Ys) \leftarrow N \neq 0, X = Y, \\ drop(N,[X|Xs],Ys) \leftarrow N \neq 0, X = Y, \\ drop(N,[X|Xs],Ys) \leftarrow N \neq 0, X = Y, \\ drop(N,[X|Xs],Ys) \leftarrow N \neq 0, X = Y, \\ drop(N,[X|Xs],Ys) \leftarrow N \neq 0, X = Y, \\ drop(N,[X|Xs],Ys) \leftarrow N \neq 0, X = Y, \\ drop(N,[X|Xs],Ys) \leftarrow N \neq 0, X = Y, \\ drop(N,[X|Xs],Ys) \leftarrow N \neq 0, X = Y, \\ drop(N,[X|Xs],Ys) \leftarrow N \neq 0, X = Y, \\ drop(N,[X|Xs],Ys) \leftarrow N \neq 0, X = Y, \\ drop(N,[X|Xs],Ys) \leftarrow N \neq 0, X = Y, \\ drop(N,[X|Xs],Ys) \leftarrow N \neq 0, X = Y, \\ drop(N,[X|Xs],Ys) \leftarrow N \neq 0, X = Y, \\ drop(N,[X|Xs],Ys) \leftarrow N \neq 0, X = Y, \\ drop(N,[X|Xs],Ys) \leftarrow N \neq 0, X = Y, \\ drop(N,[X|Xs],Ys) \leftarrow N \neq 0, X = Y, \\ drop(N,[X|Xs],Ys) \leftarrow N \neq 0, X = Y, \\ drop(N,[X|Xs],Ys) \leftarrow N \neq 0, X = Y, \\ drop(N,[X|Xs],Ys) \leftarrow N \neq 0, X = Y, \\ drop(N,[X|Xs],Ys) \leftarrow N \neq 0, X = Y, \\ drop(N,[X|Xs],Ys) \leftarrow N \neq 0, X = Y, \\ drop(N,[X|Xs],Ys) \leftarrow N \neq 0, X = Y, \\ drop(N,[X|Xs],Ys) \leftarrow N \neq 0, X = Y, \\ drop(N,[X|Xs],Ys) \leftarrow N \neq 0, X = Y, \\ drop(N,[X|Xs],Ys) \leftarrow N \neq 0, X = Y, \\ drop(N,[X|Xs],Ys) \leftarrow N \neq 0, X = Y, \\ drop(N,[X|Xs],Ys) \leftarrow N \neq 0, X = Y, \\ drop(N,[X|Xs],Ys) \leftarrow N \neq 0, X = Y, \\ drop(N,[X|Xs],Ys) \leftarrow N \neq 0, X = Y, \\ drop(N,[X|Xs],Ys) \leftarrow N \neq 0, X = Y, \\ drop(N,[X|Xs],Ys) \leftarrow N \neq 0, X = Y, \\ drop(N,[X|Xs],Ys) \leftarrow N \neq 0, X = Y, \\ drop(N,[X|Xs],Ys) \leftarrow N \neq 0, X = Y, \\ drop(N,[X|Xs],Ys) \leftarrow N \neq 0, X = Y, \\ drop(N,[X|Xs],Ys) \leftarrow N \neq 0, X = Y, \\ drop(N,[X|Xs],Ys) \leftarrow N \neq 0, X = Y, \\ drop(N,[X|Xs],Ys) \leftarrow N \neq 0, X = Y, \\ drop(N,[X|Xs],Ys) \leftarrow N \neq 0, X = Y, \\ drop(N,[X|Xs],Ys) \leftarrow N \neq 0, X = Y, \\ drop(N,[X|Xs],Ys) \leftarrow N \neq 0, X = Y, \\ drop(N,[X|Xs],Ys) \leftarrow N \neq 0, X = Y, \\ drop(N,[X|Xs],Ys) \leftarrow N \neq 0, X = Y, \\ drop(N,[X|Xs],Ys) \leftarrow N \neq 0, X = Y, \\ drop(N,[X|Xs],Ys) \leftarrow N \neq 0, X = Y, \\ drop(N,[X|Xs],Ys) \leftarrow N \neq 0, X = Y, \\ drop(N,[X|Xs],Ys) \leftarrow N \neq 0, X = Y, \\ drop(N,[X|Xs],Ys) \leftarrow N \neq 0, X = Y, \\ drop(N,[X|Xs],Ys) \leftarrow N \neq 0, X = Y, \\
```

#### The Elimination Algorithm **EC**

- Define new predicates with constraints in LIA or Bool
  - use widening operators [Cousot-Halbwachs '77, Bagnara et al. '08]
- EC guarantees equisatisfiability
- If E terminates, then EC terminates

## (4) Weak Controllability Algorithm

- (1) Generate a disjunction a(U,C) of constraints
- (2) Check whether or not  $LIA \models \forall U$ .  $adm(U) \rightarrow \exists C$ . a(U,C)
- •Assume a sound and complete LIA-constraint solver: SOLVE. For any set  $I_{SP}$  of clauses and query Q: C,  $A_1$ ,..., $A_n$  where C is a LIA constraint,

```
SOLVE(I_{SP},Q) returns
```

- a satisfiable constrain t a s.t.  $I_{SP}$  U LIA  $\models \forall (a \rightarrow Q)$ , if any,
- *false*, otherwise

```
In particular, if SOLVE(I_{SP}, reachProp(U,C)) = a(U,C), then I_{SP} U LIA \models \forall U,C. (a(U,C) \rightarrow reachProp(U,C))
```

# (4) Weak Controllability Algorithm

$$I_{SP}$$
:  $q(X) \leftarrow r(X)$   
  $r(X) \leftarrow X > 0$ 

SOLVE( $I_{SP}$ , q(X)) returns the constraint X>0 Indeed,  $I_{SP}$  U LIA  $\models \forall X \ (X>0 \rightarrow q(X))$ 

# (4) Weak Controllability Algorithm