

# Propositional Encoding of Constraints over Tree-Shaped Data

Alexander Bau\*      Johannes Waldmann

F-IMN, HTWK Leipzig, Germany

July 3, 2013

\* supported by an ESF grant

# Motivation

using a subset of Haskell for constraint system specifications

- ▶ in general: constraint system = formula in predicate logic
- ▶ here:  $\exists x : f(x)$ , with  $f$  being quantifier-free
- ▶ search for a satisfying assignment for  $x$  by generic (i.e. problem independent) techniques
- ▶ specification of predicate  $f$  as Haskell function

```
constraint :: (Int,Int) -> Bool  
constraint (a,b) = a * b == 42
```

search for satisfying assignment through transformation of  $f$  to a finite-domain constraint system

- ▶ domain:  $\{0, 1\}$
- ▶ constraint system = formula in propositional logic
- ▶ Boolean satisfiability problem (SAT)

## Motivation (II)

$\exists x : f(x)$  where  $f :: D \rightarrow \text{Bool}$

- ▶ possible types  $D$ 
  - ▶ algebraic data types ( $\text{Bool}$ ,  $\text{Maybe } a$ ,  $[a]$ ,  $\text{data } T = \dots$ )
  - ▶ restrict depth of recursions
- ▶ specification of  $f$ 
  - ▶ pattern-matching, polymorphism, higher-order functions

advantages of using Haskell for constraint system specifications

- ▶ application of an established language in another paradigm
- ▶ reuse existing code
- ▶ simple testing of found solutions against original program
- ▶ comparison to similar approaches, e.g. Curry (Hanus et al.)

our contribution: implementation by compilation to SAT

- ▶ apply fast SAT solvers like Minisat (Een, Sörensson)

## Applications (Work in Progress)

- ▶ termination analysis for rewrite systems
  - ▶ precedences for path orders
  - ▶ coefficients for interpretations
  - ▶ models for semantic labelling
  - ▶ looping derivations
- ▶ computational biology (RNA design)

SAT is assembly language of constraint programming: one wants to use it, but nobody wants to write it

SAT compilation gives

- ▶ correctness
- ▶ flexibility

## Example

```
data Bool      = False | True
```

```
data Pair a b = Pair a b
```

```
data Nat      = Z | S Nat
```

```
add x y = case x of { Z -> y; S x' -> S (add x' y) }
```

```
eq x y = case x of
```

```
  Z      -> case y of { Z      -> True      ; _ -> False }
```

```
  S x' -> case y of { S y' -> eq x' y'; _ -> False }
```

```
constraint (Pair x y) = eq (S (S (S Z))) (add x y)
```

---

```
Start producing CNF
```

```
CNF finished (#variables: 71, #clauses: 199)
```

```
Starting solver
```

```
Solver finished in 0.0 seconds (result: True)
```

```
Just (Pair Z (S (S (S Z))))
```

# Concept of Implementation

parametric constraint system

```
constraint p x = ...
```

for  $p$  given at runtime: search for satisfying assignment for  $x$

1. compilation-time:

- ▶ transformation of `constraint` to a Haskell function that generates a propositional formula

2. run-time:

- 2.1 generate propositional formula
- 2.2 solve formula by external SAT solver
- 2.3 reconstruct satisfying assignment

main challenge: pattern matches on unknown data

# Usage

transformation of constraint using Template-Haskell during GHC's compilation time

```
$([d] ...
    constraint (Pair x y) = eq (S (S (S Z)))
                                (add x y)
  ]) >>= runIO . configurable [] . compile
)
```

```
result :: IO (Maybe (Pair Nat Nat))
result = solveBoolean ... encConstraint
```

```
main = result >>= putStrLn . show
```

## Example (compiled constraint system)

```

encAdd = \encX_6 encY_7 ->
  do bindCase_267 <- return encX_6
    if isInvalid bindCase_267
      then return bindCase_267
      else do bindArgument_274 <- return encY_7
              bindArgument_275 <-
                let encX'_8 = constructorArgument 0 1 bindCase_267
                  in do bindArgument_272 <-
                        do bindArgument_269 <- return encX'_8
                          bindArgument_270 <- return encY_7
                          bindResult_268 <- encAdd bindArgument_269
                                                bindArgument_270
                        return bindResult_268
                    bindResult_271 <- encSCons bindArgument_272
                    return bindResult_271
              bindResult_273 <- caseOf bindCase_267 [bindArgument_274,
                                                    bindArgument_275]
    return bindResult_273

```

...



# Data Transformation

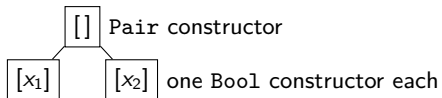
abstract value is a tree that represents a set of concrete values

- ▶ each node contains propositional variables  $[x_1, x_2, \dots]$
- ▶ they encode the index of a constructor

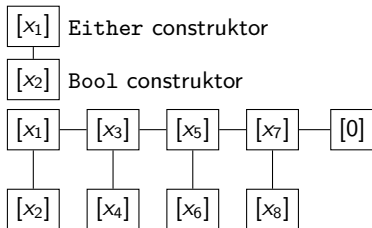
`data Bool = False | True`



`data Pair = Pair Bool Bool`



`data Either = Left Bool | Right Bool`



`data List = Nil | Cons Bool List`

# Program Transformation

pattern matches on unknown data generates clauses of the resulting propositional formula

$r, e, u, v :: \text{Bool}$

let  $r = \text{case } e \text{ of } \{ \text{False} \rightarrow u ; \text{True} \rightarrow v \}$

if

▶  $\text{abstract-value}(\text{env}, \text{compile}(e)) = [x_e]$

▶  $\text{abstract-value}(\text{env}, \text{compile}(u)) = [x_u]$

▶  $\text{abstract-value}(\text{env}, \text{compile}(v)) = [x_v]$

then

▶  $\text{abstract-value}(\text{env}, \text{compile}(r)) = [(\overline{x_e} \rightarrow x_u) \wedge (x_e \rightarrow x_v)]$

## program transformation (II)

top-level constraint is applied to two abstract values

- ▶ encoded parameter  $p$
- ▶ abstract value that represents the domain of the unknown  $x$ 
  - ▶ depth of abstract value restricts recursion

optimizations

- ▶ assumption: smaller formula  $\rightarrow$  easier to solve
- ▶ direct evaluation of pattern-matches on known data (represented by Boolean constants)
  - ▶ do not generate formulas for unreachable branches
- ▶ memoization of function calls during abstract evaluation
- ▶ built-in operations for fixed-width binary numbers

## Example - Find Looping Derivations in SRS

```

type Symbol = [ Bool ]
type Word = [ Symbol ]
type Rule = ( Word , Word )
type SRS = [ Rule ]

-- Step p (l,r) s represents p ++ l ++ s --> p ++ r ++ s
data Step = Step Word Rule Word

data Looping_Derivation = Looping_Derivation Word [Step] Word

constraint :: SRS -> Looping_Derivation -> Bool
constraint srs (Looping_Derivation pre d suf) =
  conformant srs d && eqWord (pre ++ start d ++ suf) (result d)
  ...

```

→ code size: 100 lines

## Example - Find Looping Derivations in SRS

```
> ./ttt2 -s 'dp;loop -dp -r 16 -c 16' -pstat \  
SRS/Gebhardt/03.srs
```

```
cnf generated: 23759 vars, 39541 clauses (0.746666)  
cnf solved (5.373332)
```

```
> C04/Test/Loop +RTS -K1G -RTS 16 16 SRS/Gebhardt/03.srs
```

```
CNF finished (#variables: 132954, #clauses: 450132)  
Solver finished in 42.276663 seconds (result: True)
```

# Conclusion

- ▶ use a subset of Haskell for constraint system specifications
- ▶ transformation into satisfiability problem of propositional formulas
- ▶ application 1: terminations analysis of term rewriting systems
  - ▶ precedences for path orders
  - ▶ coefficients for interpretations
  - ▶ models for semantic labelling
  - ▶ looping derivations

corresponding Haskell code is already available (CeTA)

- ▶ application 2: RNA design in computational biology
- ▶ main challenges:  
smaller formulas, faster compilation, bigger Haskell subset
- ▶ try: <https://github.com/apunktbau/co4>
- ▶ continue: <http://arxiv.org/abs/1305.4957>