

Relational Programming, Interpreters, and Program Synthesis

Dmitry Boulytchev

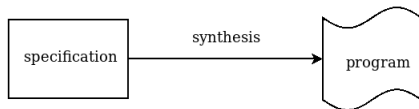
Saint Petersburg State University, Huawei

Software Engineering, Theory and Experimental Programming

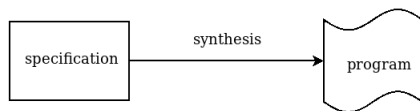
February 22, 2023

Online

Program Synthesis

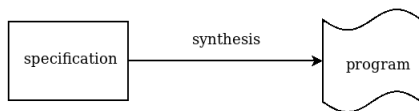


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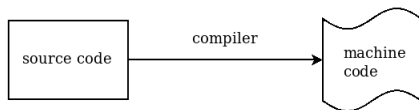


Applications of recursive arithmetic to the problem of circuit synthesis [Church, 1957]

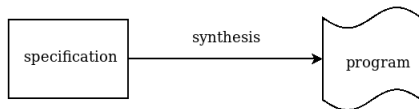
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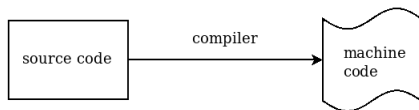
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Program Synthesis



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Solved?

“The Monkey’s Paw” Curse

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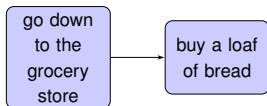
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to the
grocery
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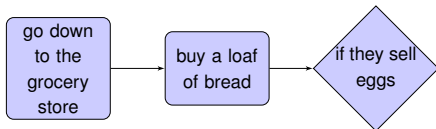
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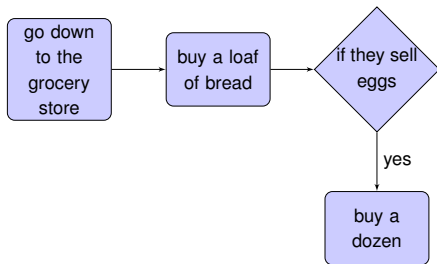
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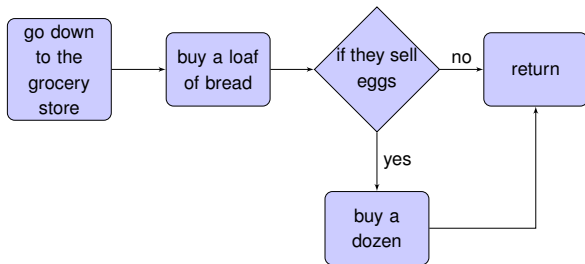
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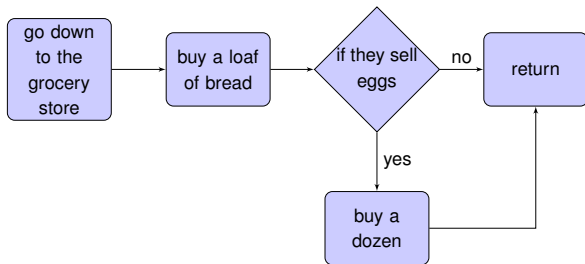
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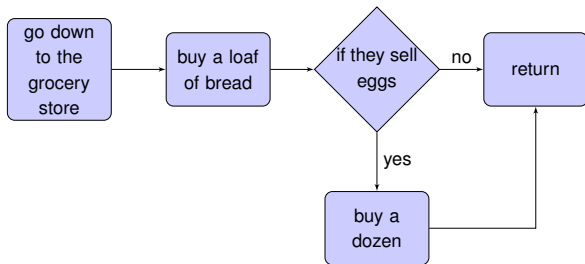
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Implementation vs. Specification

Program synthesis from polymorphic refinement types

[Polikarpova, Kuraj, Solar-Lezama, PLDI-2016]

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specification	code

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specification	code
<pre>insert :: x:α → t:BST α → {BST α keys ν = keys t + [x]}</pre>	

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specification

```
insert :: x:α → t:BST α →  
        {BST α | keys ν = keys t + [x]}
```

code

```
insert = λx. λt. match t with  
  | Empty → Node x Empty Empty  
  | Node y l r → if x ≤ y ∧ y ≤ x  
    then t  
    else if y ≤ x  
      then Node y l (insert x r)  
      else Node y (insert x l) r
```

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specification

```
insert :: x:α → t:BST α →  
      {BST α | keys ν = keys t + [x]}
```

```
termination measure size :: BST α → Int
```

```
measure keys :: BST α → Set α
```

```
data BST α where
```

```
  Empty :: {BST α | keys ν = []}
```

```
  Node :: x:α → l:BST{α | ν < x} → r:BST{α | x < ν}
```

```
    → {BST α | keys ν = keys l + keys r + [x]}
```

code

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  | Empty → Node x Empty Empty  
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```

The Program Synthesis Challenge

- Specifications tend to contain errors.
- Sometimes *imperative* description is more robust than *declarative*.
- Sometimes specification is more verbose and harder to write than implementation.

Program Transformations

Idea: make a program from another simpler one

Advantage: use conventional SE techniques to debug & test the simpler one

Program Inversion:

- sorting → permutations
- type checking → type inference
- verifier → solver

**From Standard to Non-Standard Semantics by Semantics
Modifiers** [Abramov, Glück, 2001]

Program Synthesis by Inversion

$$p\ x \mapsto y$$

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sort [5; 3; 2; 4; 1] = [1; 2; 3; 4; 5]

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$$p^{-1} \ y \mapsto \{x \mid p \ x \mapsto y\}$$

Program Synthesis by Inversion

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sort⁻¹ [1; 2; 3; 4; 5] = { l | sort l = [1; 2; 3; 4; 5] }

Program Synthesis by Inversion

$$p \ x \mapsto y$$

`sort [5; 3; 2; 4; 1] = [1; 2; 3; 4; 5]`

$$p^{-1} \ y \mapsto \{x \mid p \ x \mapsto y\}$$

`sort-1 [1; 2; 3; 4; 5] = { l | sort l = [1; 2; 3; 4; 5] }`

$$\text{invert } p = p^{-1}$$

Inversion by Relational Programming

Programs as *functions* vs. programs as *relations*

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functional	relational
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$p\ x \mapsto y$	$p^\circ\ x\ y \mapsto \{\mathbf{success}, \mathbf{failure}\}$

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$p\ x \mapsto y$	$p^\circ\ x\ y \mapsto \{\mathbf{success}, \mathbf{failure}\}$  adding free variables

Inversion by Relational Programming

Programs as *functions* vs. programs as *relations*

functional	relational
$p\ x \mapsto y$	$p^o\ x\ y \mapsto \{\mathbf{success}, \mathbf{failure}\}$
	↓ adding free variables
	$p^o\ x\ y \mapsto \{\text{substitutions for free variables in } x \text{ and } y\}$

Inversion by Relational Programming

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	$p^o\ x\ y \mapsto \{\text{substitutions for free variables in } x \text{ and } y\}$
	$\text{sort}^o\ \alpha\ [1; 2; 3; 4; 5]$

A minimalistic relational language in the form of a DSL

The Reasoned Schemer [Byrd, Friedman, Kiselyov, 2005]

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PROLOG = HC + DFS + EXTRA-LOGIC FEATURES

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MINIKANREN

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MINIKANREN = HC + COMPLETE INTERLEAVING SEARCH

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MINIKANREN: Syntax

Terms:

$$\mathcal{X} = \{x_1, x_2, \dots\}$$

$$\mathcal{F} = \{f_1^{k_1}, f_2^{k_2}, \dots\}$$

$$\mathcal{T}_X = \mathcal{X} \cup \{f^n(t_1, \dots, t_n) \mid f^n \in \mathcal{F}, t_i \in \mathcal{T}_X\}$$

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Goals (all terms are in \mathcal{T}_X):

$$\mathcal{G} = t_1 \equiv t_2$$

$$g_1 \wedge g_2$$

$$g_1 \vee g_2$$

$$\exists x. g$$

$$R t_1 \dots t_k$$

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Definitions:

$$R = \lambda x_1 \dots x_k. g$$

MINIKANREN → PROLOG

example = $\lambda x y. y \equiv A \wedge (\exists z. x \equiv B(z) \vee \text{foo}(y, z))$

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MINIKANREN → PROLOG

$$\text{example} = \lambda x y . y \equiv A \wedge (\exists z . x \equiv B(z) \vee \text{foo}(y, z))$$

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- 2 transform to DNF (by folding suitable subgoals into auxiliary definitions);

$$\begin{aligned} \text{example}' &= \lambda x y z . x \equiv B(z) \vee \text{foo}(y, z) \\ \text{example} &= \lambda x y . y \equiv A \wedge \text{example}'(x, y, z) \end{aligned}$$

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- 3 introduce a separate Horn clause for each of the disjuncts, pulling the top-level unifications to the head's arguments:

$$\begin{array}{lll} \text{example}' & (b(Z), _, Z). & \\ \text{example}' & (_, Y, Z) & \vdash \text{foo}(Y, Z). \\ \text{example} & (X, a) & \vdash \text{example}'(X, a, Z). \end{array}$$

PROLOG → MINIKANREN

append([], *Y*, *Y*).

append([*H*|*T*], *Y*, [*H*|*TY*]) ⊢ *append*(*T*, *Y*, *TY*).

PROLOG \rightarrow MINIKANREN

$append([], Y, Y).$

$append([H|T], Y, [H|TY]) \vdash append(T, Y, TY).$

- 1 rename the arguments in Horn clauses heads coherently adding explicit unifications where needed;

$append(X, Y, Z) \vdash X \equiv [] \wedge Y \equiv Z.$

$append(X, Y, Z) \vdash X \equiv [H|T] \wedge Z \equiv [H|TY] \wedge append(T, Y, TY).$

PROLOG → MINIKANREN

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- 3 join the clauses with the same heads into the one relational definition using disjunction:

$$\text{append} = \lambda x, y, z. (x \equiv [] \wedge y \equiv z) \vee \exists h t t y. x \equiv h : t \wedge \text{append } t y t y$$

MINIKANREN: Semantics

- Denotational: least Herbrand model.

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 - sound & complete w.r.t. LHM;
 - refutationally *incomplete*.

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Typed Relational Conversion [Lozov, Vyatkin, Boulytchev, TFP-2017]

Certified Semantics for Relational Programming [Rozplokhas, Boulytchev, APLAS-2020]

Certified Semantics with Disequality [Rozplikhas, Boulytchev, miniKanren-2021]

Interleaving Search: Idea

Idea: build a semantics of a goal as a *state*-transforming function:

$$\llbracket \bullet \rrbracket : \mathcal{G} \rightarrow St \rightarrow St^*$$

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- St^* — a *lazy* stream of states.

Interleaving Search: Idea

Idea: build a semantics of a goal as a *state*-transforming function:

$$\llbracket \bullet \rrbracket : \mathcal{G} \rightarrow St \rightarrow St^*$$

- St — states (contain everything needed to make a step);
- St^* — a *lazy* stream of states.

Laziness is important for completeness:

$$foo = \lambda x . foo\ x \vee x \equiv 5$$

Interleaving Search: Blueprint

$$\llbracket t_1 \equiv t_2 \rrbracket \sigma = \begin{cases} \varepsilon & , t_1 \text{ and } t_2 \text{ do not have a unifier} \\ MGU(\sigma, t_1, t_2) & , \text{ otherwise} \end{cases}$$

$$\llbracket g_1 \wedge g_2 \rrbracket \sigma = \text{concat}(\text{map} \llbracket g_2 \rrbracket (\llbracket g_1 \rrbracket \sigma))$$

$$\llbracket g_1 \vee g_2 \rrbracket \sigma = \llbracket g_1 \rrbracket \sigma \oplus \llbracket g_2 \rrbracket \sigma$$

$$\llbracket \exists x. g \rrbracket \sigma = \llbracket g[x \leftarrow \alpha] \rrbracket \sigma', \langle \alpha, \sigma' \rangle = \mathbf{fresh} \sigma$$

$$\llbracket R t_1 \dots t_k \rrbracket \sigma = \llbracket g[x_1 \leftarrow t_1] \rrbracket \sigma, R = \lambda x_1 \dots x_k. g$$

Interleaving Search: Details

$$\mathcal{A} = \{\alpha_1, \alpha_2, \dots\} \text{ (all terms now in } \mathcal{T}_{X \cup \mathcal{A}})$$

$$\Sigma = \mathcal{A} \rightarrow \mathcal{T}_{\mathcal{A}}$$

$$St = \Sigma \times \mathfrak{P}(\mathcal{A})$$

$$St_0 = \langle \Lambda, \mathcal{A} \rangle$$

$$MGU(\langle \sigma, P \rangle, t_1, t_2) = \langle mgu(t_1\sigma, t_2\sigma), P \rangle$$

$$\mathbf{fresh} \langle \sigma, P \rangle = \langle \alpha, \langle \sigma, P \setminus \{\alpha\} \rangle \rangle, \alpha \in P$$

$$f \oplus g = \begin{cases} g & , f = \varepsilon \\ \sigma(g \oplus f') & , f = \sigma f' \end{cases}$$

Backtracking, Interleaving, and Terminating Monad Transformers

[Kiselyov, Chung-chieh Shan, Friedman, Sabry, ICFP-2005]

OCANREN: a Strongly Typed MINIKANREN for OCAML

Typed Embedding of a Relational Language in OCaml [Kosarev,
Boulytchev, ML-2016]

O CANREN: a Strongly Typed MINIKANREN for OCAML

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```
let rec appendo x y xy = conde [  
  ((x ≡ nil ()) &&& (y ≡ xy));  
  call_fresh (fun h →  
    call_fresh (fun t →  
      call_fresh (fun ty →  
        (x ≡ h % t) &&&  
        (h % ty ≡ xy) &&&  
        (appendo t y ty'))))  
    ]
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    ]
```

```
let rec appendo x y xy = ocanren {  
  x == [] & y == xy |  
  fresh h, t, ty in  
    x == h :: t &  
    z == h :: ty &  
    appendo t y ty  
}
```

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```

- Disequality constraints;
- Tabling;
- Wildcard variables;
- ...

OCANREN: Typing

Types in the functional world:

```
type  $\alpha$  list = [] |  $\alpha$  ::  $\alpha$  list
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```
fresh h, t, ty in  
  x == h :: t &  
  z == h :: ty
```

Types in the relational world:

- a *logic* list can be either a free variable
- ... or []
- ... or $h :: t$, where
 - h is a logic element of list
 - t is a *logic* list

Relational types cannot be acquired by some parameterization of functional ones.

OCCANREN: Abstraction, Lifting, Injection

Type abstraction:

```
type ( $\alpha$ ,  $\beta$ ) alist = [] |  $\alpha$  ::  $\beta$   
type  $\alpha$  list = ( $\alpha$ ,  $\alpha$  list) alist
```

OCCANREN: Abstraction, Lifting, Injection

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```
type ( $\alpha$ ,  $\beta$ ) alist = [] |  $\alpha$  ::  $\beta$   
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```

Logic type:

```
type  $\alpha$  logic = Var of var | Val of  $\alpha$ 
```

OCANREN: Abstraction, Lifting, Injection

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type ( $\alpha$ ,  $\beta$ ) alist = [] |  $\alpha$  ::  $\beta$   
type  $\alpha$  list = ( $\alpha$ ,  $\alpha$  list) alist
```

Logic type:

```
type  $\alpha$  logic = Var of var | Val of  $\alpha$ 
```

Logic lists:

```
type  $\alpha$  llist = (( $\alpha$ ,  $\alpha$  llist) alist) logic
```


OCANREN: Abstraction, Lifting, Injection

Type abstraction:

```
type ( $\alpha$ ,  $\beta$ ) alist = [] |  $\alpha$  ::  $\beta$   
type  $\alpha$  list = ( $\alpha$ ,  $\alpha$  list) alist
```

Logic type:

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type  $\alpha$  logic = Var of var | Val of  $\alpha$ 
```

Logic lists:

```
type  $\alpha$  llist = (( $\alpha$ ,  $\alpha$  llist) alist) logic
```

Transformation α list \rightarrow α llist:

- on *type* level: *lifting*
- on *value* level: *injection*

OCanren: Reification, Example

```
open OCanren
open GT

ocanren type nat = 0 | S of nat

let rec addo x y z = ocanren {
  x == 0 & y == z |
  fresh x', z' in
  x == S x' &
  z == S z' &
  addo x' y z'
}

let _ =
  Stream.iter (fun q → Printf.printf "q=%s\n" @@ GT.show(nat) q) @@
  run q
  (fun q → ocanren {addo (S 0) (S (S 0)) q})
  (fun q → q#reify nat_prj_exn)
```

Generic Programming with Combinators and Objects [Kosarev,
Boulytchev, ML-2021]

Typed Relational Conversion: Motivation

Relational programming is hard and error-prone

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```
let rec append x y =  
  match x of  
    []      → y  
  | h :: t → h :: (append t y)
```

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Relational programming is hard and error-prone

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```
let rec appendo x y xy = ocanren {  
  x == [] & y == xy |  
  fresh h, t, ty in  
    x == h :: t &  
    z == h :: ty &  
    appendo t y ty  
}
```

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}
```

Unnesting:

```
let rec append x y =  
  match x of  
    []      → y  
  | h :: t  →  
    let ty = append t y in  
    h :: ty
```

Unnesting: Higher-Order Case

```
let bar x =  
  let f x = x in  
  let g a = f in  
  g A x
```

Unnesting: Higher-Order Case

```
let bar x =  
  let f x = x in  
  let g a = f in  
  g A x
```

```
let bar0 x r = ocanren {  
  let f x r = x == r in  
  let g a r = f == r in  
  g A x r  
}
```


Typed Relational Conversion: Idea

On the type level:

\mathcal{G} — the type of goals

$$\begin{aligned} \llbracket a \rrbracket &\mapsto a \rightarrow \mathcal{G} \\ \llbracket t_1 \rightarrow t_2 \rrbracket &\mapsto \llbracket t_1 \rrbracket \rightarrow \llbracket t_2 \rrbracket \end{aligned}$$

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On the term level:

- pure λ -calculus is left intact!
- pattern-matching goes to disjunction (too long to present);
- constructor:

$$\begin{aligned} \llbracket C(e_1, \dots, e_k) \rrbracket &\mapsto && \mathbf{fun} \ q \rightarrow \\ &&& \mathbf{fresh} \ q_1, \dots, q_k \ \mathbf{in} \\ &&& \llbracket e_1 \rrbracket \ q_1 \wedge \\ &&& \dots \\ &&& \llbracket e_k \rrbracket \ q_k \wedge \\ &&& q \equiv \uparrow C(q_1, \dots, q_k) \end{aligned}$$

Typed Relational Conversion: NOCANREN

```
let rec addo x y =  
  match x with  
    0    → y  
  | S x' → S (addo x' y)
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Typed Relational Conversion: NOCANREN

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let rec addo x y =  
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```
let rec addo x y q5 = ocanren {  
  fresh q1 in  
    x q1 &  
    (q1 == 0 & y q5 |  
      fresh x', q2 in  
        q1 == S x' &  
        q5 == S q2 &  
        addo ((==) x') y q2  
    )  
}
```

Typed Relational Conversion: NOCANREN

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```

- + administrative reductions;
- + “best practices” for relational programming.

Typed Relational Conversion [Lozov, Vyatkin, Boulytchev, 2017]

Interpreters and Relational Interpreters

Conventional interpreter:

$$\mathit{eval} \ p \ x \mapsto y \iff p \ x \mapsto y$$

Interpreters and Relational Interpreters

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$$\text{eval } p \ x \mapsto y \Leftrightarrow p \ x \mapsto y$$

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Benefits: with a relational interpreter for a certain language all programs in this language can be executed relationally

A Unified Approach to Solving Seven Programming Problems (Functional Pearl) [Byrd, Ballantyne, Rosenblatt, Might, ICFP-2017]

Search Problems, Verifiers, Solvers

Search problem: given a combinatorial object Ω find some object s satisfying property \mathcal{P} .

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$$\text{verify } \Omega s = \begin{cases} \mathbf{true} & , \text{ } s \text{ is a solution} \\ \mathbf{false} & , \text{ otherwise} \end{cases}$$

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$$\text{verify}^0 \Omega \sigma \mathbf{true}$$

Search Problems, Verifiers, Solvers

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Relational Interpreters for Search Problems [Verbitskaya, Berezun, Lozov, Boulytchev, MK-2019]

Water Pouring Puzzle: Description

Water pouring puzzle

From Wikipedia, the free encyclopedia

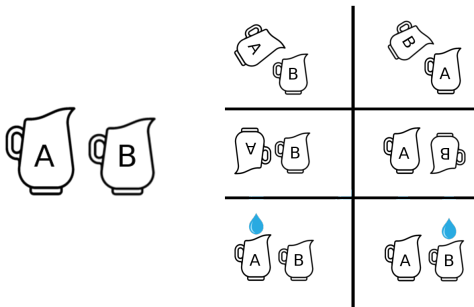


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Find sources: "Water pouring puzzle" – news · newspapers · books · scholar · JSTOR (July 2017) (Learn how and when to remove this template message)

Water pouring puzzles (also called **water jug problems**, **decanting problems**,^{[1][2]} **measuring puzzles**, or **Die Hard with a Vengeance puzzles**) are a class of **puzzle** involving a finite collection of **water jugs** of known **integer** capacities (in terms of a **liquid measure** such as **liters** or **gallons**). Initially each jug contains a known integer volume of liquid, not necessarily equal to its capacity.

Puzzles of this type ask how many steps of pouring water from one jug to another (until either one jug becomes empty or the other becomes full) are needed to reach a goal state, specified in terms of the volume of liquid that must be present in some jug or jugs.^[3]



Water Pouring Puzzle: Functional Verifier

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$$\mathcal{M} = \{A \rightarrow B, B \rightarrow A, \uparrow A, \uparrow B, \downarrow A, \downarrow B\}$$

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Water Pouring Puzzle: Functional Verifier

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$$\mathcal{C} \xrightarrow{\mathcal{M}^*} \mathcal{C}$$

```
type move = AB | BA | FillA | FillB | EmptyA | EmptyB
```

```
let step (capA, capB, a, b) = function
```

```
| FillA  → (capA, capB, capA, b)
```

```
| FillB  → (capA, capB, a, capB)
```

```
| EmptyA → (capA, capB, 0, b)
```

```
| EmptyB → (capA, capB, a, 0)
```

```
| AB     → let diff = capB - b in  
          (capA, capB, a - diff, b + (min diff a))
```

```
| BA     → let diff = capA - a in  
          (capA, capB, a + (min diff b), b - diff)
```

```
let eval = fold step
```

Water Pouring Puzzle: Relational Solver

```
run $\mu$  { fresh a, b in  
  evalo(5, 3, 0, 0)  $\mu$  (_, _, a, b) &  
  (a == 1 | b == 1)  
}  $\mapsto$  [ $\mu \mapsto$  (FillB, BA, FillB, BA)], ...
```

Water Pouring Puzzle: Relational Solver

$$\mathbf{run}_\mu \left\{ \begin{array}{l} \mathbf{fresh} \ a, b \ \mathbf{in} \\ \mathit{eval}^o(5, 3, 0, 0) \ \mu \ (_, _, a, b) \ \& \\ (a == 1 \mid b == 1) \\ \end{array} \right\} \mapsto [\mu \mapsto (\mathbf{FillB}, \mathbf{BA}, \mathbf{FillB}, \mathbf{BA}), \dots]$$

- Other puzzles: Einstein problem, Jeep problem, Bridge & Torch, Hanoi towers, etc.
- Unification (verifier \rightarrow unifier).
- Type checker \rightarrow type inferencer (STLC).

Application: Pattern-Matching Synthesis

Relational Synthesis for Pattern Matching [Kosarev, Boulytchev,
APLAS-2020]

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Constructors, values, and patterns:

$$\begin{aligned}\mathcal{C} &= \{C_1^{k_1}, \dots, C_n^{k_n}\} \\ \mathcal{V} &= C \mathcal{V}^* \\ \mathcal{P} &= - \mid C \mathcal{P}^*\end{aligned}$$

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Declarative semantics of pattern-matching:

$$\langle v; p_1, \dots, p_k \rangle \longrightarrow i, 1 \leq i \leq k + 1$$

Application: Pattern-Matching Synthesis

Relational Synthesis for Pattern Matching [Kosarev, Boulytchev, APLAS-2020]

“Switch” language:

$$\begin{array}{l} \mathcal{M} = \bullet \\ \quad | \mathcal{M}[\mathbb{N}] \\ \mathcal{S} = \mathbf{return} \mathbb{N} \\ \quad | \mathbf{switch} \mathcal{M} \mathbf{with} [C \rightarrow \mathcal{S}]^* \mathbf{otherwise} \mathcal{S} \end{array}$$

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The semantics of switch language:

$$v \vdash \pi \Longrightarrow_{\mathcal{S}} i$$

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The semantics of switch language:

$$v \vdash \pi \Longrightarrow_S i$$

Pattern-matching synthesis problem: for a given ordered sequence of patterns p_1, \dots, p_k find a switch program π , such that

$$\forall v \in \mathcal{V}, \forall 1 \leq i \leq n+1 : \langle v; p_1, \dots, p_n \rangle \longrightarrow i \iff v \vdash \pi \Longrightarrow_S i$$

Application: Declarative UI Synthesis

On a Declarative Guideline-Directed UI Layout Synthesis [Kosarev,
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- Structure: a set of UI controls and relations between them.

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- Structure: a set of UI controls and relations between them.
- Layout: a set of primitives describing the placements of UI controls.

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- Structure: a set of UI controls and relations between them.
- Layout: a set of primitives describing the placements of UI controls.
- Guideline: a set of rules mapping structure elements to layout primitives.

Application: Declarative UI Synthesis

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- Structure: a set of UI controls and relations between them.
- Layout: a set of primitives describing the placements of UI controls.
- Guideline: a set of rules mapping structure elements to layout primitives.
- Layout synthesis problem: for a given structure find all maximal sets of non-contradictory layout primitive instances prescribed by a guideline.

Thank you!

Links:

- <http://minikanren.org/> — the main MINIKANREN site;
- <https://github.com/PLTools/OCanren> — OCANREN implementation;
- <https://github.com/PLTools/noCanren> — NOCANREN implementation.

Future research:

- Performance improvements.
- Heuristic search.
- Extensions.
- More applications.

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