

Introduction and Foundations of Program Inversion

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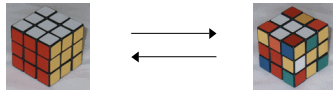
Today's Plan

- Inversion: a basic operation on programs
- Short review: inversion in mathematics
 - Relations, functions
 - Applications in science & technology
- The programming world
 - Inverse interpreter
 - Program inverter
 - and their existence

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Review: Inverse Computation

- **Standard Computation:**
Calculation of the output of a program
for a given input ('forward execution')
- **Inverse Computation:**
Calculation of the possible input of a program
for a given output ('backward execution')



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Manifestations: Underlying Principles and Relation?

Software

- **Undo Operations:** Word, Emacs, ...
- **Tracing:** debugging, simulation, ...
- **Translation:** decompilation, unparsing, ...
- **AI:** problem solving, logic reasoning, ...

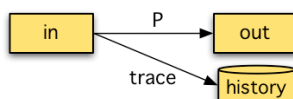
Hardware

- **Reversible hardware:** reduce heat dissipation, quantum computer, low-power CMOS, ...
- **Reversible languages:** for reversible hardware, ...

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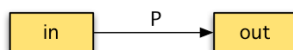
Two Types of Inversion

• Tracing:



Bennett:73, ... Carothers at al.99
apps: Word, Excel, ...
- usually *ad hoc* inversion
- partial trace of non-invertibles
- size of trace \approx length of comp.
- first forward, then backward
- instrumented forward prog.
- synchronized with inverse prog.

• Stand-alone:



Dijkstra:78, Gries:81, manual;
MuBird:02, conv-of-fct-theorem;
automatic: Korf&Eppstein:85
automatic: one of our goals!

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A Common Operation on Programs: Inversion

- Fundamental concept in mathematics
- Received little attention in computer science
- Inverse programs frequently used. A familiar example:



- State of the art: inverse programs are written manually
- Motivation: "Get two programs from one program."

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Programs as Data Objects (review)

1. Three Basic Operations

- Specialization of programs (A)
- Composition of programs (B)
- Inversion of programs (C)

2. Layers of these Operations

- Self-application (e.g. Futamura projections)
- Program generators (e.g. Ershov generating extensions)
- Metasystem transition schemes (by Turchin)

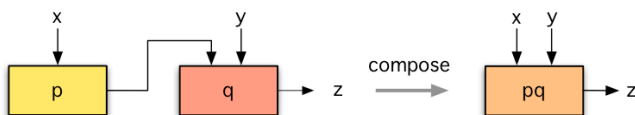
Operation A: Program Specializer



- faster program
- often shorter program
- most advanced operation

Example: partial evaluation [Jones et al. '93]

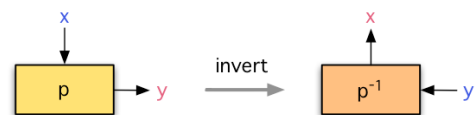
Operation B: Program Composer



- faster program
- rm interface operations
- rm redundant computations
- reduce memory

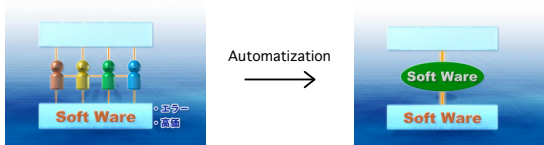
Example technique: deforestation [Wadler'90]

Operation C: Program Inverter



- “two for the price of one”
- example: encode / decode text

Approach: “Programs that produce Programs”



Build programs that treat programs as data objects:

- Automatically manipulate programs by programs
 - Analyse & transform programs by programs
- ▲ Programs are semantically the **most complex form** of data objects in the computer.

Motivation: Industrial Principle

Despite tremendous progress in hardware, the production of software is

- manual
- error prone
- costly

Recently, exploding demand for software led to

- dramatic lack of skilled programmers
- low software quality

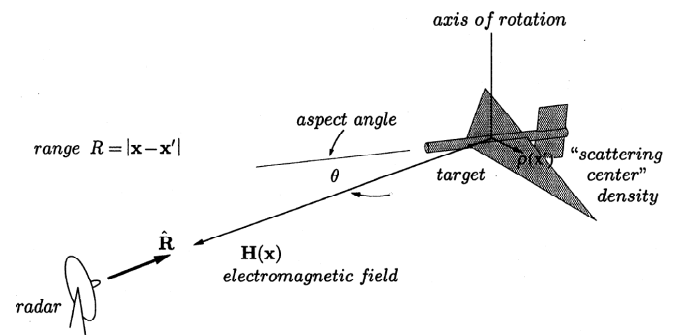
⇒ **Business as usual is not an option in the long run.**
 ⇒ **Methods for automatized SW production needed.**
Important goal for Computer Science research.

Inverse Problems in Science and Engineering (1)

- **Example:** Given a math. model of how electromagnetic waves are reflected by an object, solve the inverse problem:
What are the object attributes (e.g. shape, position), given the intensity of the electromagnetic waves scattered by it?
- **Inverse problems** appear frequently – for instance in
medical imaging, computer tomography, radar recognition, seismic exploration, etc.
- A branch of mathematics deals with finding **mathematical solutions** to inverse problems in science and engineering. Continuous and discrete solutions, accuracy, etc.

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Inverse Problems in Science and Engineering (2)



[Borden:97]

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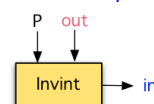
Programming World

1. A **program** is the **implementation of a function** in a programming language: many variants!
2. In general, **programs may not terminate**, they are only partially defined.
3. Even if an **efficient inverse program** p^{-1} is known to exist, it may be **hard or impossible to derive it automatically**.
4. A **trivial inverse program** p^{-1} of p can **always** be generated.
5. **Program properties:** consumption of time, space, energy...

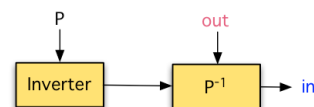
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Two Approaches to Inversion of Program $P \text{ in} \Rightarrow \text{out}$

- **Inverse interpreter** [McCarthy'56 ...]:



- **Program inverter** [Dijkstra'78, Gries'81 ...]:



- Related by **Futamura projections** [AbramovGlück'98]:
The generating extension of an inverse interpreter is a pgm inverter.

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Research Results

1. Algorithm for Inverse Interpreter

Example: Universal Resolving Algorithm (URA), McCarthy's Generate-and-Test algorithm.

2. Algorithms for Program Inversion

Example: Program inverter for functional language.

3. Transform Inverse Interpreter into Program Inverter

Example: Self-applicable partial evaluator turns Inverse interpreter into program inverter.

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State-of-the-Art

Inverse Computation:

- McCarthy '56
- logic programming '74
- ...
- Abramov, Glück '00

Program inversion:

- Dijkstra '78
- Gries '81
- ...
- Mu, Bird '02

Given the **fundamental importance** of program inversion, surprisingly few works have been devoted to this topic.

Status: little known about manual & automatic pgm inversion. state-of-the-art is rather modest (after 1/2 century CS).

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Inverse Interpreter

- Definition:** An L-program **invert** is an inverse interpreter for injective N-programs iff $\forall \text{injective } p, \forall x, y:$

$$[\text{invert}]_L(p, y) = x \Leftrightarrow [p]_N x = y$$

- Example:** let **encode** be a program to encode text:

$$[\text{encode}]_N \text{ text} = \text{code}$$

Instead of writing a decoder to reproduce the text:

$$[\text{decode}]_N \text{ code} = \text{text}$$

Use an inverse interpreter to obtain the same result:

$$[\text{invert}]_L(\text{encode}, \text{code}) = \text{text}$$

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Existence of Inverse Interpreter: Generate & Test

```

input: program p, output out
n ← const; k ← const; unmark all possible inputs;
loop
  B ← the first n possible inputs that are unmarked
  for all b ∈ B do
    compute  $\llbracket p \rrbracket b$  (with maximally  $k \cdot n$  steps)
    x ← result of computation
    if x is a value then
      mark b
      if x = out then print b endif
    endif
  endfor
  increment n
endloop
  
```

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Assesment: Inverse Interpreter w/Generate & Test

The algorithm is

- **correct:** finds all possible inputs for a given output.
- **very slow:** tries all possible inputs, many times, even if they can never lead to the desired result, combinatorial explosion!

BUT: sufficient to show the existence of inverse programs and program inverters in a Turing-complete programming language.

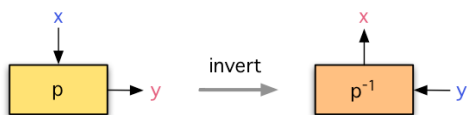
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Trivial Inverse Program

Task: Given a program *p* and an inverse interpreter **invert**, define an inverse program p^{-1} in one line.
(Hint: There exists a trivial definition of the inverse program.)

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Program Inverter



$$[p] x = y \Leftrightarrow [p^{-1}] y = x \quad \text{where } p^{-1} = [\text{inverter}] p$$

p injective

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Trivial Program Inverter

Task: Given an inverse interpreter, define a program inverter.
(Hint: There exists a trivial definition of the program inverter.)

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Trivial Inverse Interpreter

Task: Given a program inverter, define an inverse interpreter.
(Hint: There exists a [trivial](#) definition of the inverse interpreter.)

Summary: Existence of Inverse Programs and Tools

1. Existence of inverse program:

For every **program** p written in a universal programming language L , there exists an **inverse program** p^{-1} written in L .

2. Existence of the inversion tools:

For every universal programming language L , there exists an **inverse interpreter** and a **program inverter** for L written in L .

For every program p written in L , one can perform **inverse computation of p** and **invert program p** .

Remark: universal = Turing-complete.

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Inverse Interpreter: Universal Resolving Algorithm (URA)

- Algorithm for inverse computation.
- First-order functional programming language.
- Computes universal solution for non-injective programs.
- Implemented in Scheme and Haskell.

Abramov, Glück: The universal resolving algorithm and its correctness: inverse computation in a functional language.
In: *Science of Computer Programming*, 43(2-3): 193-229, 2002.

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Example: Inverse Computation of 'Inorder Traversal'

Source Program:

$\llbracket \text{inorder} \rrbracket_{TSG} t_i = [7, 6, 5, 4, 3, 2, 1]$

Input-Output:

$cls_{io} = \langle ([Xe_1], [7, 6, 5, 4, 3, 2, 1]), \emptyset \rangle$

Inverse Computation:

$\llbracket \text{ura} \rrbracket_{SCM} [\text{inorder}, cls_{io}] = [$
 $([Xe_1 \mapsto ((1:2:3):4:5):6:7], \emptyset),$
 $([Xe_1 \mapsto (1:2:3:4:5):6:7], \emptyset),$
 $([Xe_1 \mapsto (1:2:3):4:5:6:7], \emptyset),$
 $([Xe_1 \mapsto 1:2:(3:4:5):6:7], \emptyset),$
 $([Xe_1 \mapsto 1:2:3:4:5:6:7], \emptyset), \dots$

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Logic Programming

Source Program:

```
append([], Ys, Ys).  
append([X|Xs], Ys, [X|Zs]) :- append(Xs, Ys, Zs)
```

Standard Computation:

$\text{append}([1,2,3], [4,5], \text{Out})$

Solution:

$\text{Out}=[1,2,3,4,5]$

Inverse Computation:

$\text{append}(\text{In1}, \text{In2}, [1,2,3,4,5])$

Solution:

$\text{In1}=[], \text{In2}=[1,2,3,4,5]$
 $\text{In1}=[1], \text{In2}=[2,3,4,5]$
...
 $\text{In1}=[1,2,3,4,5], \text{In2}=[]$

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Technical Remark: Format for Program Inversion (1)

1. Single Output, Single Input

$$f(x) = y \Leftrightarrow x = f^{-1}(y)$$

2. Multiple Outputs, Multiple Inputs

$$\begin{array}{lcl} f_1(x_1, \dots, x_m) = y_1 & & x_1 = f_1^{-1}(y_1, \dots, y_n) \\ \dots & \Leftrightarrow & \dots \\ f_n(x_1, \dots, x_m) = y_n & & x_m = f_m^{-1}(y_1, \dots, y_n) \end{array}$$

two injective systems of functions
where $f_i: A \rightarrow B$, $f_j^{-1}: B \rightarrow A$

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Technical Remark: Format for Program Inversion (2)

a. Tupled

$$f([x_1, \dots, x_m]) = [y_1, \dots, y_n] \Leftrightarrow [x_1, \dots, x_m] = f^{-1}([y_1, \dots, y_n])$$

b. Untupled

$$\begin{aligned} f_1(x_1, \dots, x_m) &= y_1 & \Leftrightarrow & \quad x_1 = f_1^{-1}(y_1, \dots, y_n) \\ f_n(x_1, \dots, x_m) &= y_n & \Leftrightarrow & \quad x_m = f_n^{-1}(y_1, \dots, y_n) \end{aligned}$$

injective system of functions where $f_i: A \rightarrow B$, $f_j^{-1}: B \rightarrow A$

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Example for Program Inversion

• Function System

```
(take 3 '(A B C D E)) = (A B C)
(drop 3 '(A B C D E)) = (D E)

(A B C D E) = (append '(A B C) '(D E))
3 = (length '(A B C) '(D E))
```

• Definition in Lisp-like source language

```
((take drop) (n xs) ; def.header
 (if (zerop n) nil ; take
      (cons (car xs) (take (sub1 n) (cdr xs)))) ; take
 (if (zerop n) xs ; drop
      (drop (sub1 n) (cdr xs)))) ; drop
```

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More Primitive Operators

Numbers:

$$\begin{aligned} (\text{add } x_1 \ x_2) &= y_1 & \Leftrightarrow & \quad x_1 = (\text{sub } y_1 \ y_2) \\ x_2 &= y_2 & & \quad x_2 = y_2 \end{aligned}$$

$$\begin{aligned} (\text{sub } x_1 \ x_2) &= y_1 & \Leftrightarrow & \quad x_1 = (\text{add } y_1 \ y_2) \\ x_2 &= y_2 & & \quad x_2 = y_2 \end{aligned}$$

$$\begin{aligned} (\text{mul } x_1 \ x_2) &= y_1 & \Leftrightarrow & \quad x_1 = (\text{div } y_1 \ y_2) \\ x_2 &= y_2 & & \quad x_2 = y_2 \end{aligned}$$

$$\begin{aligned} (\text{div } x_1 \ x_2) &= y_1 & \Leftrightarrow & \quad x_1 = (\text{mul } y_1 \ y_2) \\ x_2 &= y_2 & & \quad x_2 = y_2 \end{aligned}$$

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Invertible in Theory and Practice?

• Limits of numerical representations

$$\begin{aligned} (\text{div } x_1 \ x_2) &= y_1 & \Leftrightarrow & \quad x_1 = (\text{mul } y_1 \ y_2) \\ x_2 &= y_2 & & \quad x_2 = y_2 \end{aligned}$$

Example:

$$\begin{aligned} (\text{div } 1 \ 3) &= 0.333 & \Leftrightarrow & \quad 0.999 = (\text{mul } 0.333 \ 3) \\ 3 &= 3 & & \quad 3 = 3 \end{aligned}$$

$$1 \neq 0.999$$

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