

MATHEW CARR

MSc. Project:

Code Generation Through
Genetic Programming

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Compiler

- Compilers translate from one language to another
- High level (human readable) to low level (efficiently executable)
- Almost all software is produced through use of a compiler

Why Consider Compilers?

- Compilers are not available for some architectures
- Where compilers are available, they may not take advantage of certain architecture-specific features:
Advanced instructions: SIMD, DMA, etc.

Compilation Process

- Source code – High level program
Parsing, lexical analysis
- Intermediate representation –
Parse tree, symbol table.
Code generation
- Object code – Low level program
Linking
- Executable

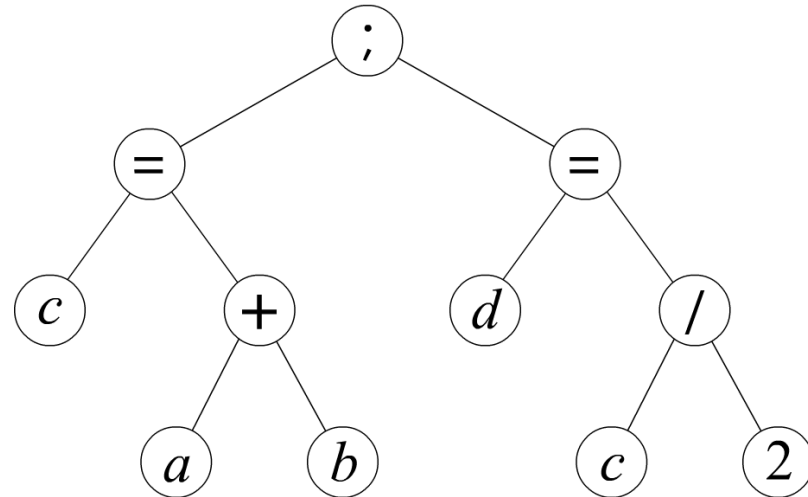
Code Generation

- Transformation from intermediate representation into object code
- Highly dependent on target architecture
- Register allocation
- Instruction selection
- Instruction sequencing

“Calculate the mean of the values of the variables a and b and store the result in variable d”

c = a + b;

d = c / 2



LOADS	0,	a	// load the value of variable a into r0
LOADS	1,	b	// load the value of variable b into r1
ADD	0,	0, 1	// add the values of r0 and r1; store result in r0
LOADV	1,	2	// load the direct value 2 into r1
DIVP	0,	0, 1	// divide value of r0 by that of r1; store result in r0
STORS	0,	d	// store the value of register 0 into variable d
HALT			// end program

Approach: Genetic Programming

- Output computer programs through induction
- Automatically solves problems without having to know the size or shape of the solution in advance
- Requires method to determine suitability, or 'fitness', of candidate solutions

How Does GP Work?

- Creation of random initial population
- Fitness of all programs calculated
- New programs produced through recombination or alteration of 'fit' programs from the population
- Repeat until suitable program is found, or continue to find 'fitter' programs

Linear Genetic Programming

- We want to create programs consisting of a linear sequence of instructions
- Linear GP directly works upon, and returns, linear sequences of nodes
- Similar crossover and mutation operations

Instruction String a

Instruction a1
Instruction a2
Instruction a3
Instruction a4
Instruction a5
Instruction a6
Instruction a7
Instruction a8
Instruction a9

Instruction String b

Instruction b1
Instruction b2
Instruction b3
Instruction b4
Instruction b5
Instruction b6
Instruction b7
Instruction b8

New Instruction String a

Instruction a1
Instruction b3
Instruction b4
Instruction b5
Instruction b6
Instruction a8
Instruction a9

New Instruction String b

Instruction b1
Instruction b2
Instruction a2
Instruction a3
Instruction a4
Instruction a5
Instruction a6
Instruction a7
Instruction b7
Instruction b8

Project Approach

- Induce low level assembly-like programs for simple register machine architecture
- Specify architecture
- Determine method to calculate fitness of candidate solutions
- Determine method to calculate if candidate is correct

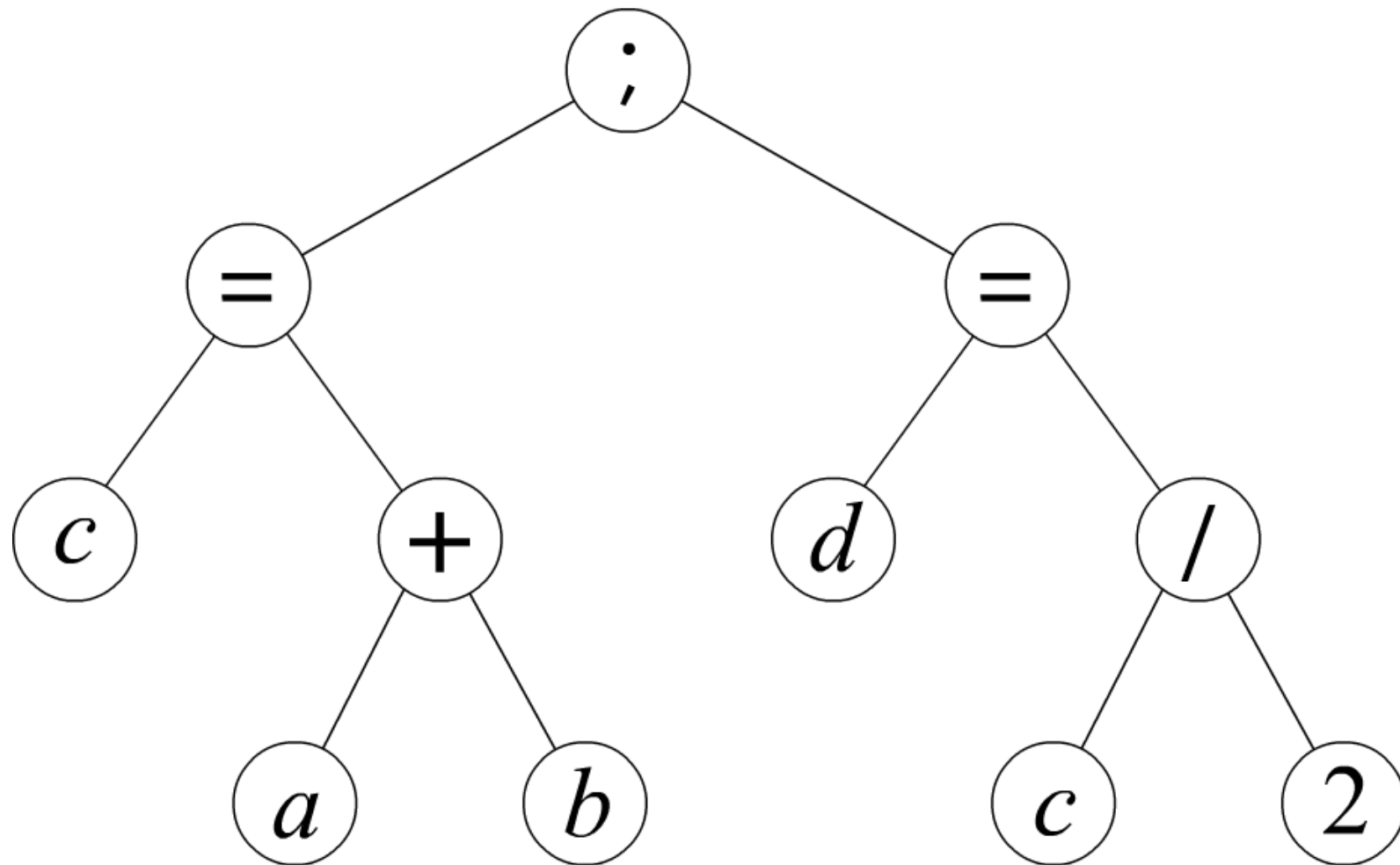
Fitness Cases

- Purely symbolic representations of system state are hard to work with
- Instead, work with sufficiently representative sampling of all possible input states

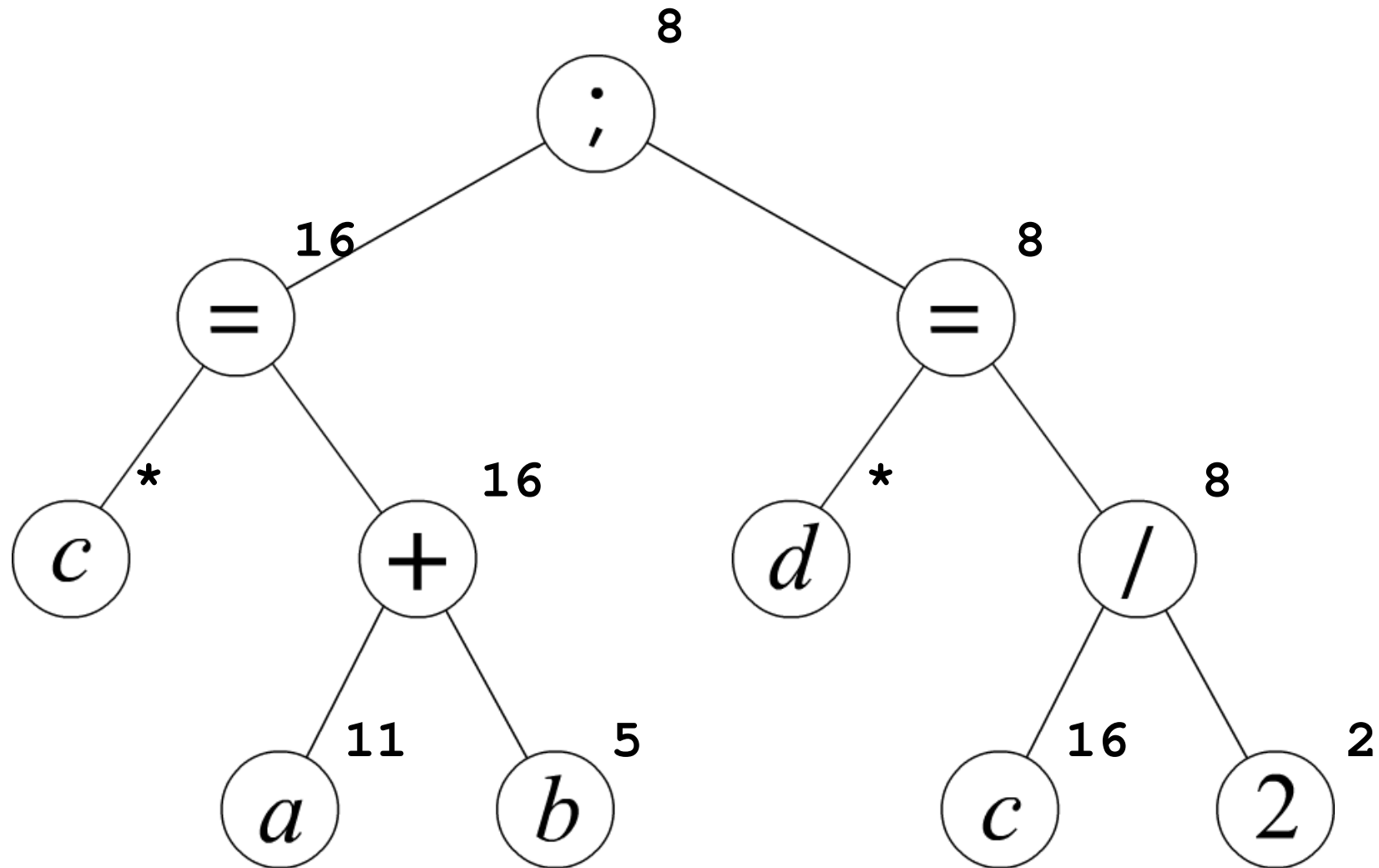
Fitness Evaluation

- Provide a real valued measure of how 'close' a program is to a solution
- Consider the actions taken within the system during execution
- Reward actions that seem productive; penalise actions that seem counterproductive
- Solution criteria are derived from contents of symbol table

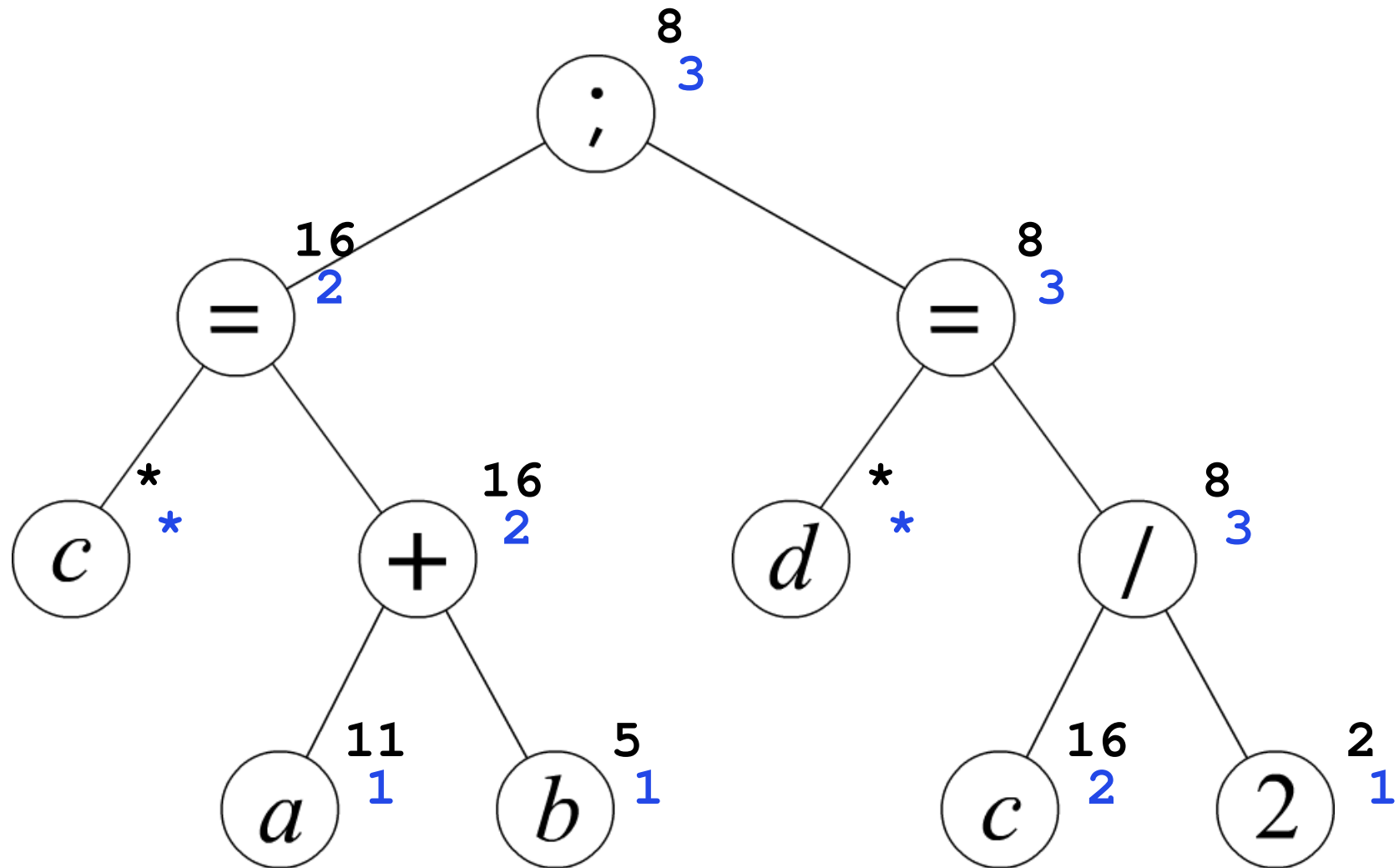
For all a and b:



For the case where $a = 11$ and $b = 5$:



For the case where $a = 11$ and $b = 5$:



For the case where $a = 11$ and $b = 5$:

Program is correct if program terminates and:

The value of d is 8;

The value of a is 11;

The value of b is 5

LOADS 0, a	$r0 = a$	$r0 = 11$
LOADS 1, c	$r1 = c$	$r1 = ?$
ADD 0, 1, 0	$r0 = r1 + r0$	$r0 = ? + 11 \quad r0 = ?$
LOADS 2, b	$r2 = b$	$r2 = 5$
LOADS 0, a	$r0 = a$	$r0 = 11$
ADD 1, 2, 0	$r1 = r2 + r0$	$r1 = 5 + 11 \quad r1 = 16$
LOADV 0, 2	$r0 = 2$	
STORS 2, d	$d = r2$	$d = 5$
DIV 0, 1, 0	$r0 = r1 / r0$	$r0 = 16 / 2 \quad r0 = 8$

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The value of a is 11;

The value of b is 5

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DIV 0, 1, 0	$r0 = r1 / r0$	$r0 = 16 / 2 \quad r0 = 8$

LOADS 0, a	r0 = a	r0 = 11
LOADS 1, c	r1 = c	r1 = ?
ADD 0, 1, 0	r0 = r1 + r0	r0 = ? + 11 r0 = ?
LOADS 2, b	r2 = b	r2 = 5
LOADS 0, a	r0 = a	r0 = 11
ADD 1, 2, 0	r1 = r2 + r0	r1 = 5 + 11 r1 = 16
LOADV 0, 2	r0 = 2	
STORS 1, d	d = r1	d = 16
LOADS 2, d	r2 = d	r2 = 16
DIV 2, 2, 0	r2 = r2 / r0	r2 = 16 / 2 r2 = 8
STORS 2, d	d = r2	d = 8
DIV 0, 1, 0	r0 = r1 / r0	r0 = 16 / 2 r0 = 8

This appears to be a viable solution program

Does it work for all fitness cases?

If so, return it as the solution

Thank you

Any questions?