

# Superoptimization

How fast can your code go?

James Pallister  
University of Bristol & Embecosm

# What is superoptimization?



Unoptimized  
code

# What is superoptimization?



Unoptimized  
code



Compiler  
optimized  
code

# What is superoptimization?



Unoptimized  
code



Compiler  
optimized  
code



Superoptimized  
code

# Plan for today

What is superoptimization?



Latest developments



The GNU Superoptimizer



# Plan for today

*What is superoptimization?*



Latest developments



The GNU Superoptimizer



# Superoptimization in action

```
int sign(int n)
{
    if(n > 0)
        return 1;
    else if(n < 0)
        return -1;
    else
        return 0;
}
```

# Superoptimization in action

```
int sign(int n)
{
    if(n > 0)
        return 1;
    else if(n < 0)
        return -1;
    else
        return 0;
}
```

# Superoptimization in action

```
int sign(int n)                                cmp.l d0, 0
{                                                 ble     L1
    if(n > 0)                                 move.l d1, 1
        return 1;                               bra     L3
    else if(n < 0)                            L1:
        return -1;                             bge    L2
    else                                         move.l d1, -1
        return 0;                               bra     L3
}                                                 L2:
                                                move.l d1, 0
                                                L3:
```

# Superoptimization in action

```
int sign(int n)                                add.l d0, d0
{                                                 subx.l d1, d1
    if(n > 0)                                 negx.l d0
                                                addx.l d1, d1
        return 1;
    else if(n < 0)
        return -1;
    else
        return 0;
}
```

# Superoptimization in action

```
int sign(int n)          cmp.l  d0, 0      add.l  d0, d0
{                         ble    L1           subx.l d1, d1
  if(n > 0)             move.l d1, 1      negx.l d0
    return 1;            bra    L3           addx.l d1, d1
  else if(n < 0)        L1:                bge    L2
    return -1;           move.l d1, -1
  else                  bra    L3           move.l d1, 0
    return 0;            L2:                move.l d1, 0
}                         L3:
```

# How does it work?

d0 ← n

add.l d0, d0

subx.l d1, d1

negx.l d0

addrx.l d1, d1

d1 → sign(n)

# How does it work?

$d0 \leftarrow n$

x	d0	d1
---	----	----

0	-3	
---	----	--

**add.l d0, d0**  
**subx.l d1, d1**  
**negx.l d0**  
**addrx.l d1, d1**

$d1 \rightarrow \text{sign}(n)$

x	d0	d1
---	----	----

0	0	
---	---	--

x	d0	d1
---	----	----

0	2	
---	---	--

# How does it work?

$d_0 \leftarrow n$

x	d0	d1
---	----	----

0	-3	
---	----	--

**add.l d0, d0**

1	-6	
---	----	--

**subx.l d1, d1**

0	0	
---	---	--

**negx.l d0**

0	0	
---	---	--

**addrx.l d1, d1**

0	4	
---	---	--

$d_1 \rightarrow \text{sign}(n)$

x	d0	d1
---	----	----

0	0	
---	---	--

0	2	
---	---	--

# How does it work?

$d_0 \leftarrow n$

x	d0	d1
---	----	----

0	-3	
---	----	--

**add.l d0, d0**

1	-6	
---	----	--

0	-6	-1
---	----	----

**negx.l d0**

**addrx.l d1, d1**

$d_1 \rightarrow \text{sign}(n)$

x	d0	d1
---	----	----

0	0	
---	---	--

x	d0	d1
---	----	----

0	2	
---	---	--

0	4	
---	---	--

0	4	0
---	---	---

# How does it work?

$d_0 \leftarrow n$

x	d0	d1
0	-3	

x	d0	d1
0	0	

x	d0	d1
0	2	

**add.l d0, d0**

x	d0	d1
1	-6	

x	d0	d1
0	-6	-1

x	d0	d1
1	6	-1

**negx.l d0**

**addx.l d1, d1**

$d_1 \rightarrow \text{sign}(n)$

x	d0	d1
0	0	

x	d0	d1
0	0	0

x	d0	d1
0	4	

x	d0	d1
0	4	0

x	d0	d1
1	-4	0

# How does it work?

$d0 \leftarrow n$

x	d0	d1
---	----	----

0	-3	
---	----	--

**add.l d0, d0**

1	-6	
---	----	--

**subx.l d1, d1**

0	-6	-1
---	----	----

**negx.l d0**

1	6	-1
---	---	----

**addir.l d1, d1**

0	6	-1
---	---	----

$d1 \rightarrow \text{sign}(n)$

x	d0	d1
---	----	----

0	0	
---	---	--

x	d0	d1
---	----	----

0	2	
---	---	--

0	4	
---	---	--

0	4	0
---	---	---

1	-4	0
---	----	---

0	-4	1
---	----	---

# How does it work?

$d_0 \leftarrow n$

x	d0	d1
---	----	----

0	-3	
---	----	--

**add.l d0, d0**

1	-6	
---	----	--

0	-6	-1
---	----	----

1	6	-1
---	---	----

0	6	-1
---	---	----

**negx.l d0**

1	-6	-1
---	----	----

**addx.l d1, d1**

-1
----

$d_1 \rightarrow \text{sign}(n)$

-1
----

x	d0	d1
---	----	----

0	0	
---	---	--

x	d0	d1
---	----	----

0	2	
---	---	--

0	4	
---	---	--

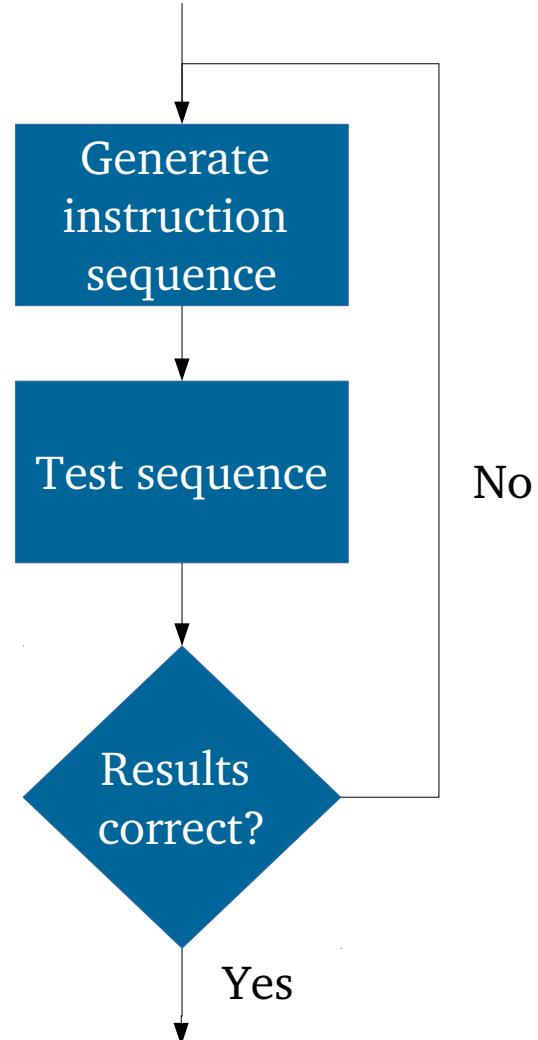
0	4	0
---	---	---

1	-4	0
---	----	---

0	-4	1
---	----	---

1
---

# “A look at the smallest program”



Massalin, H. (1987). Superoptimizer - A Look at the Smallest Program. ACM SIGARCH Computer Architecture News, 122–126.

# A recent example: Atmel AVR

# A recent example: Atmel AVR

Is  $x$  a power of 2?

# A recent example: Atmel AVR

Is x a power of 2?

```
r = !( (x-1) & x) && x;
```

# A recent example: Atmel AVR

Is x a power of 2?

```
r = !( (x-1) & x) && x;
```

Compiled code

```
mov    r20, r24
ldi    r21, 0
mov    r22, r20
mov    r19, r21
subi   r22, 1
sbc    r19, r1
and    r22, r20
and    r19, r21
or     r22, r19
brne   .+0
ldi    r25, 0x01
cpse   r24, 1
rjmp   .+0
ldi    r25, 0
mov    r24, r25
ret
ldi    r24, 0
ret
```

# A recent example: Atmel AVR

Is x a power of 2?

```
r = !( (x-1) & x) && x;
```

Compiled code

```
mov r20, r24
ldi r21, 0
mov r22, r20
mov r19, r21
subi r22, 1
sbc r19, r1
and r22, r20
and r19, r21
or r22, r19
brne .+0
ldi r25, 0x01
cpse r24, 1
rjmp .+0
ldi r25, 0
mov r24, r25
ret
ldi r24, 0
ret
```

Superoptimized code

```
mov r1,r0
dec r1
eor r0,r1
sub r1,r0
adc r1,r1
and r1,r0
ret
```

# Superoptimization fundamentals: Enumeration

# Superoptimization fundamentals: Enumeration

## Generating the sequences of instructions

# Superoptimization fundamentals: Enumeration

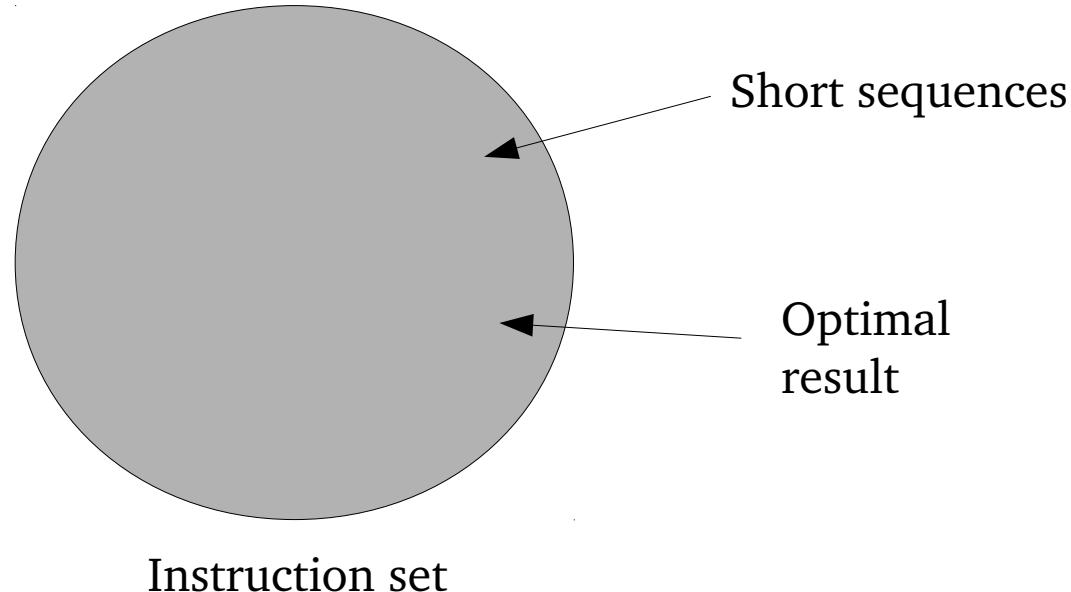
Generating the sequences of instructions

- But doing them all takes far too long

# Superoptimization fundamentals: Enumeration

Generating the sequences of instructions

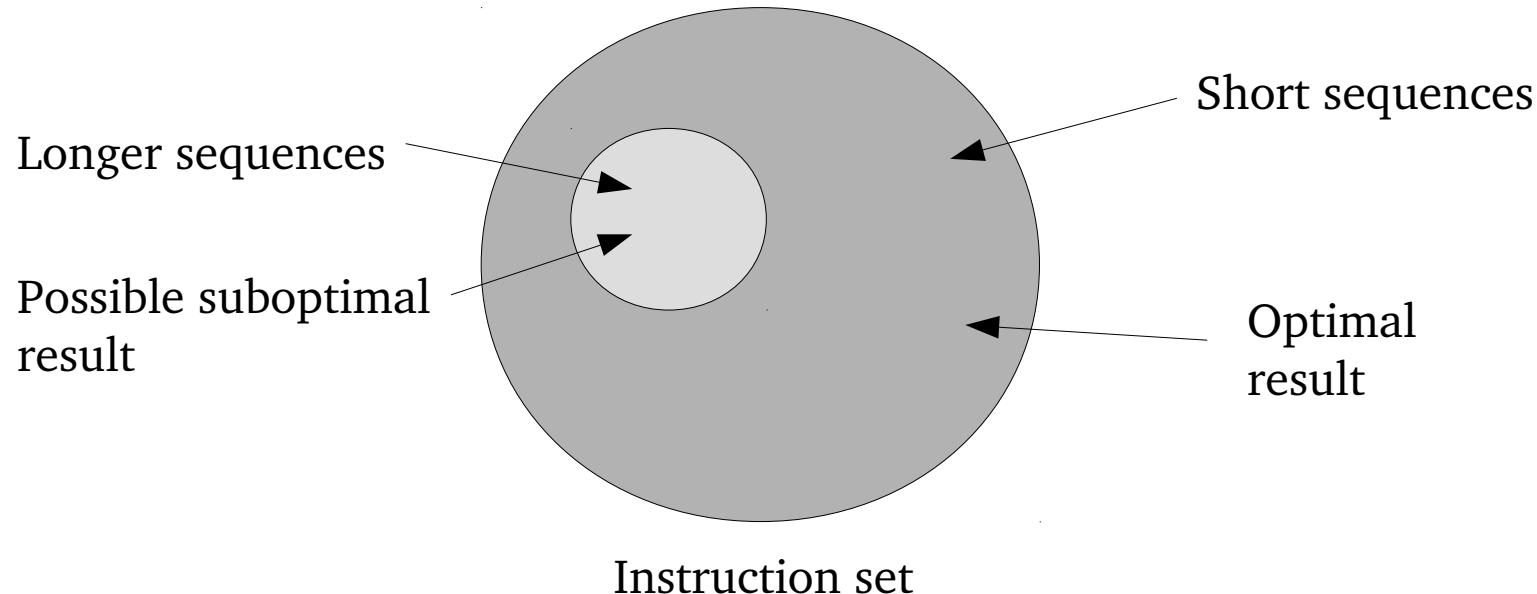
- But doing them all takes far too long



# Superoptimization fundamentals: Enumeration

Generating the sequences of instructions

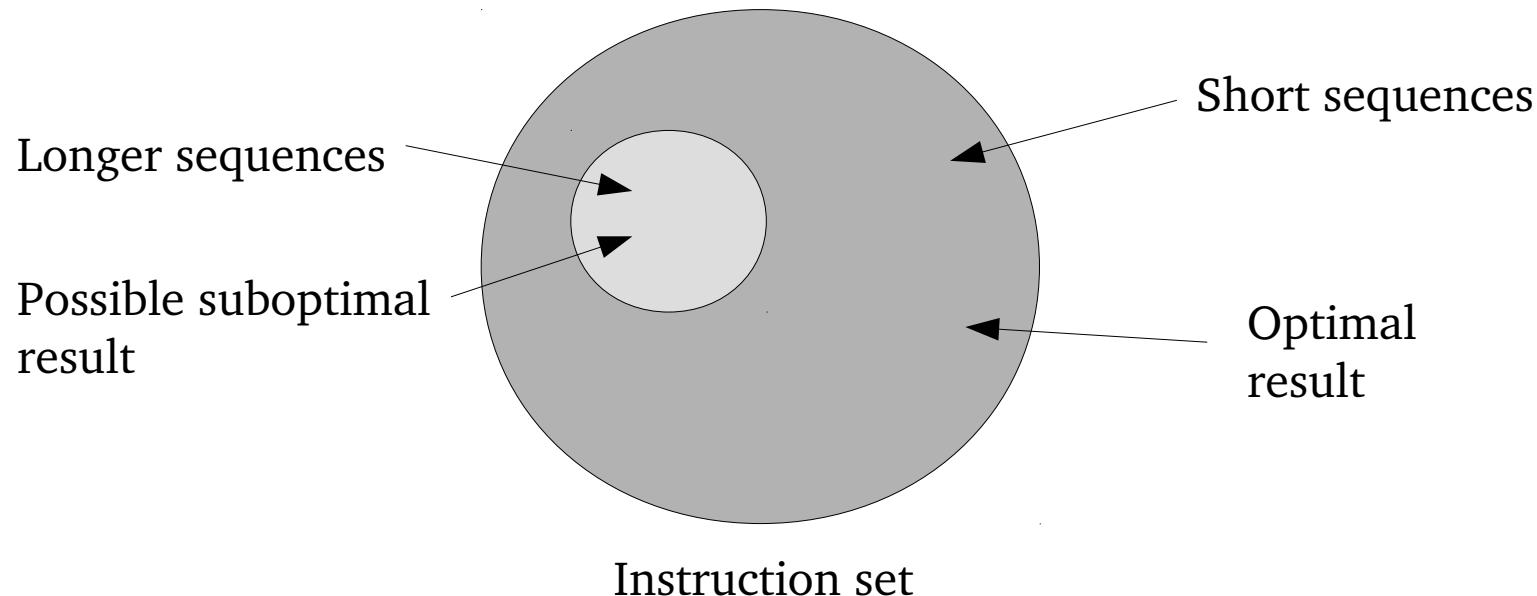
- But doing them all takes far too long



# Superoptimization fundamentals: Enumeration

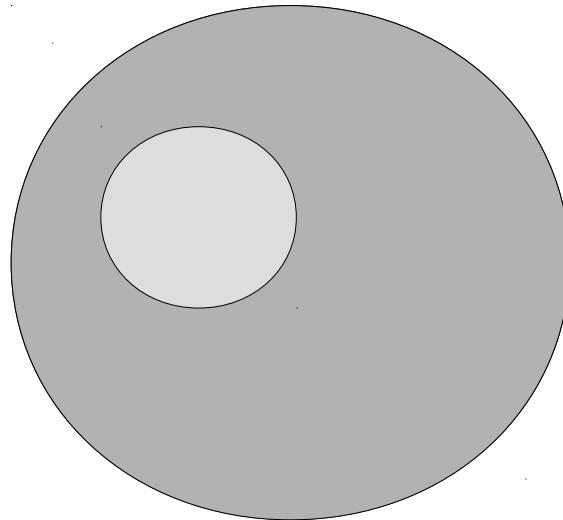
## Generating the sequences of instructions

- But doing them all takes far too long



How to select the sequences of instructions?

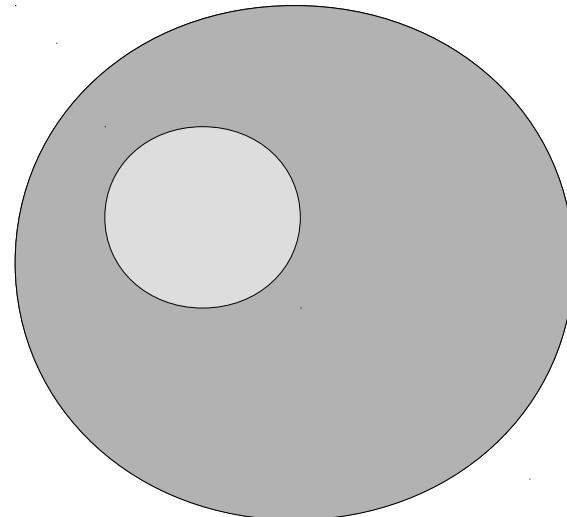
# Superoptimization fundamentals: Pruning



Instruction set

# Superoptimization fundamentals: Pruning

Not all instruction sequences are valid.

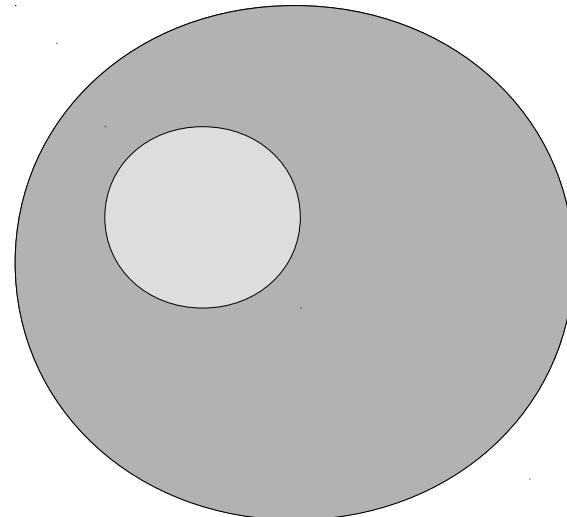


Instruction set

# Superoptimization fundamentals: Pruning

Not all instruction sequences are valid.

How do we quickly ignore bad sequences?

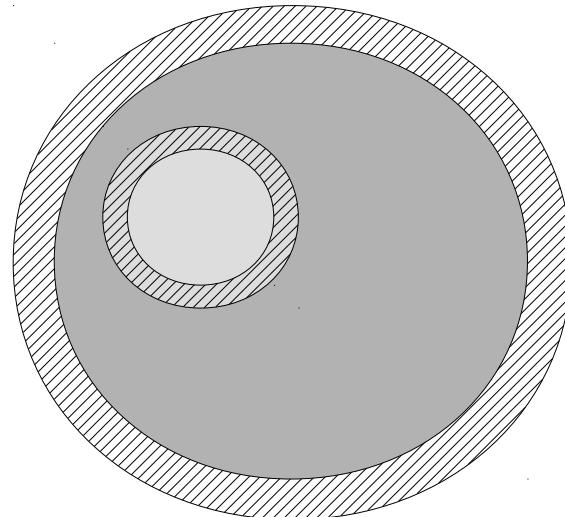


Instruction set

# Superoptimization fundamentals: Pruning

Not all instruction sequences are valid.

How do we quickly ignore bad sequences?

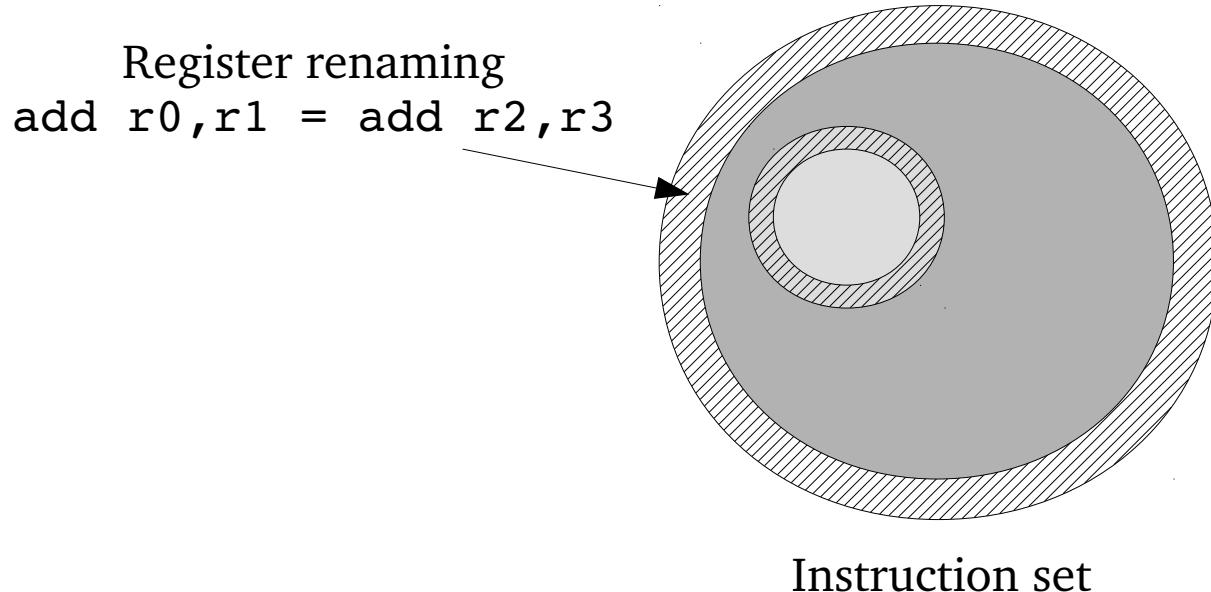


Instruction set

# Superoptimization fundamentals: Pruning

Not all instruction sequences are valid.

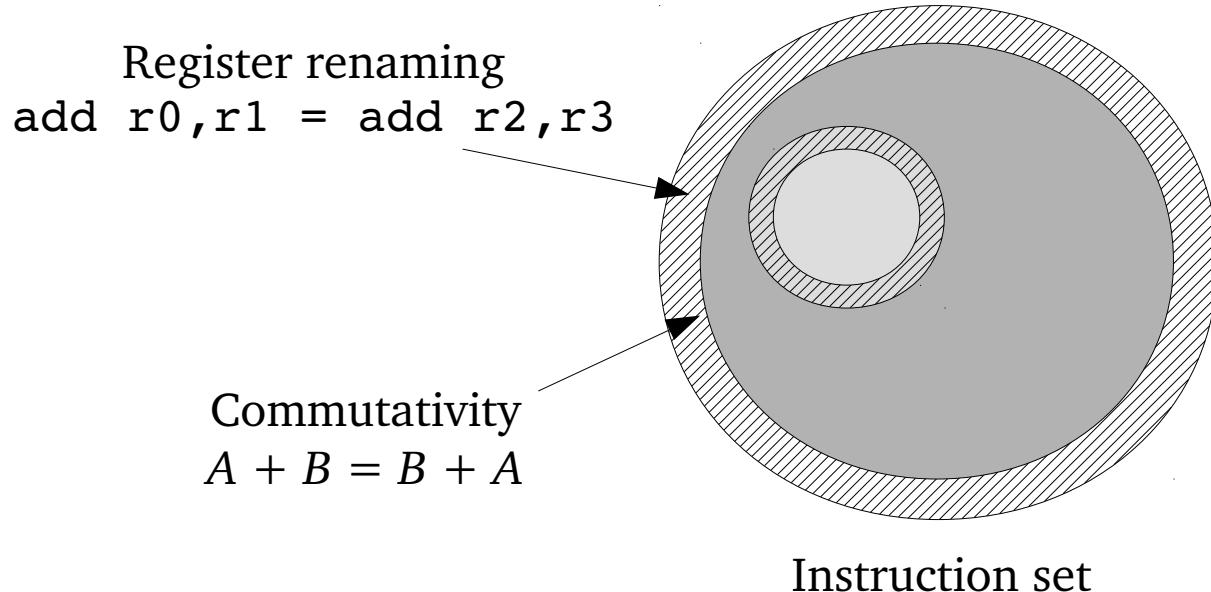
How do we quickly ignore bad sequences?



# Superoptimization fundamentals: Pruning

Not all instruction sequences are valid.

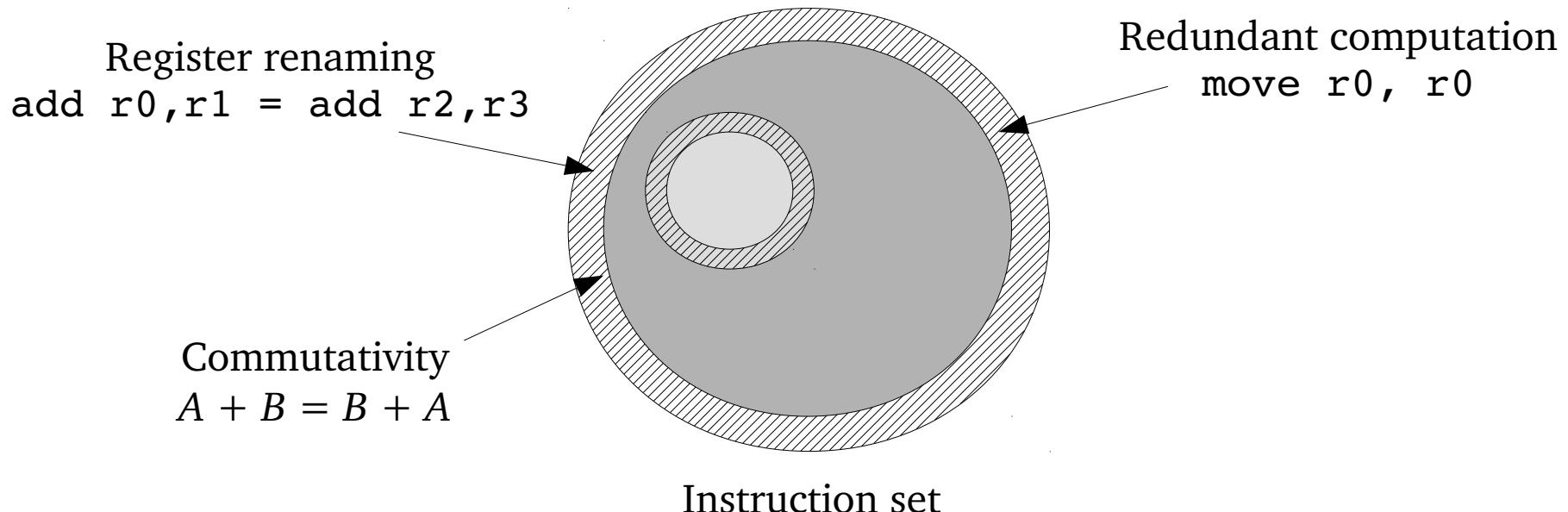
How do we quickly ignore bad sequences?



# Superoptimization fundamentals: Pruning

Not all instruction sequences are valid.

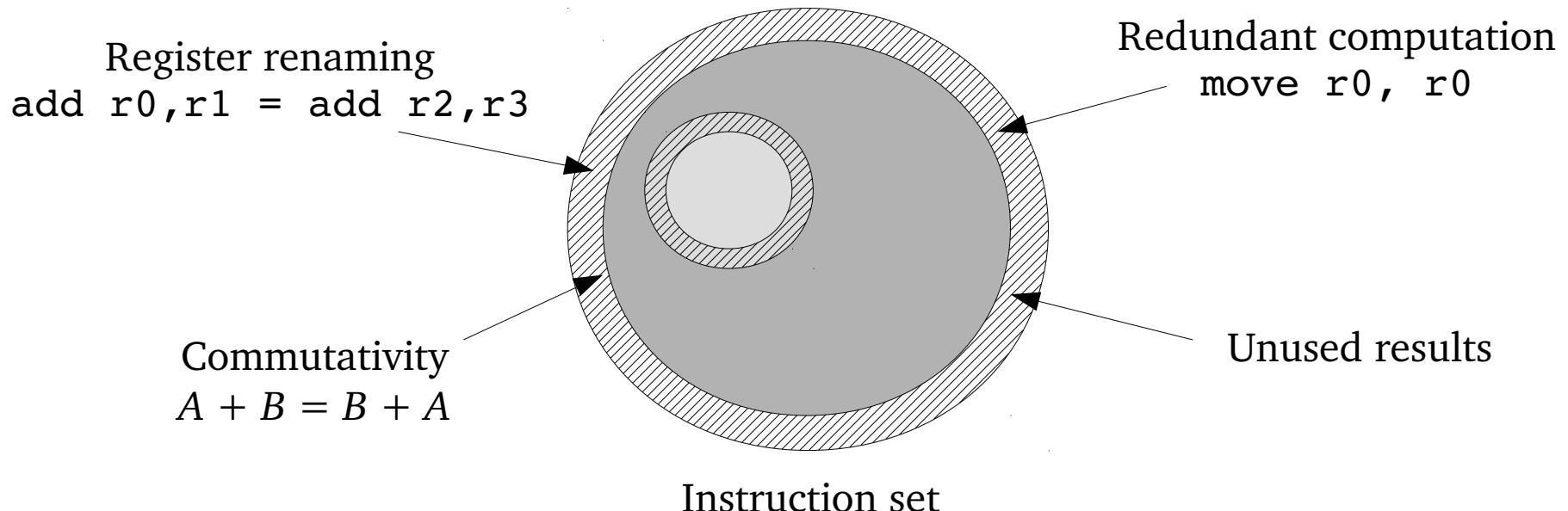
How do we quickly ignore bad sequences?



# Superoptimization fundamentals: Pruning

Not all instruction sequences are valid.

How do we quickly ignore bad sequences?



# Superoptimization fundamentals: Testing

# Superoptimization fundamentals: Testing

Is the sequence correct?

# Superoptimization fundamentals: Testing

Is the sequence correct?

Testing  
(simulation)



# Superoptimization fundamentals: Testing

Is the sequence correct?

Testing  
(simulation)



Mathematical proof  
(symbolic solving)

5	3		7					
6			1	9	5			
	9	8				6		
8								
4								
0x=0			$1+x=1$					
$xx=x$			$x+x=x$					
$x\bar{x}=0$			$x+\bar{x}=1$					
$xy=yx$			$x+y=y+x$					
$(xy)z=x(yz)$			$(x+y)+z=x+(y+z)$					
$x+yz=(x+y)(x+z)$			$x(y+z)=xy+xz$					
$x+yz=x$			$x+xy=x$					
$x(x+y)=x$								

# Superoptimization fundamentals: Testing

Is the sequence correct?

Testing  
(simulation)



Mathematical proof  
(symbolic solving)

5	3		7					
6			1	9	5			
	9	8				6		
8								
4								
0x=0			$1+x=1$					
$xx=x$			$x+x=x$					
$x\bar{x}=0$			$x+\bar{x}=1$					
$xy=yx$			$x+y=y+x$					
$(xy)z=x(yz)$			$(x+y)+z=x+(y+z)$					
$x+yz=(x+y)(x+z)$			$x(y+z)=xy+xz$					
$x+xy=x$			$x+xy=x$					
$x(x+y)=x$								

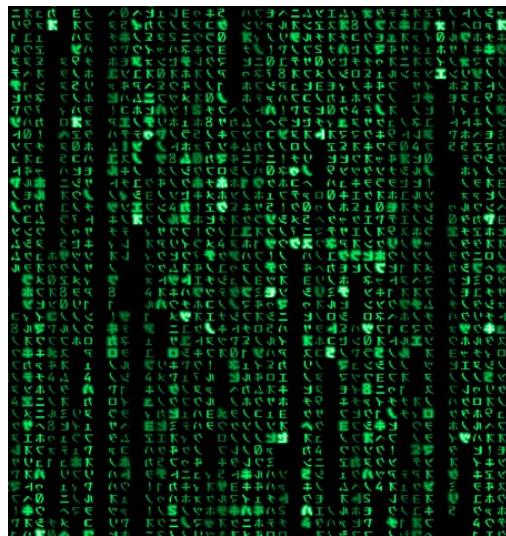
A mathematical proof grid for the laws of Boolean algebra. The grid shows the results of applying various laws to a sequence of terms. A diagonal line from bottom-left to top-right indicates the original sequence. Other lines show the results of applying laws like De Morgan's, distributivity, and idempotence. The grid is mostly empty, indicating many laws hold trivially or are redundant.

1. Choose some input
2. Run/simulate
3. Check output

# Superoptimization fundamentals: Testing

Is the sequence correct?

Testing  
(simulation)



1. Choose some input
2. Run/simulate
3. Check output

Mathematical proof  
(symbolic solving)

5	3		7				
6			1	9	5		
	9	8				6	
8							3
4							1
0x=0			$1+x=1$				
$xx=x$			$x+x=x$				
$xx=0$			$x+\bar{x}=1$				
$xy=yx$			$x+y=y+x$				
$(xy)z=x(yz)$			$(x+y)+z=x+(y+z)$				
$(xy)z=(x+y)(xz)$			$(x+y)+z=xy+xz$				
$x+yz=(x+y)(x+z)$			$x+xy=x$				
$x(x+y)=x$				8	7	9	

Formal verification  
Proves the sequence correct  
Slow

# Superoptimization fundamentals: Testing

Is the sequence correct?

Testing  
(simulation)



Use Both

1. Choose some input
2. Run/simulate
3. Check output

Mathematical proof  
(symbolic solving)

5	3		7					
6			1	9	5			
	9	8					6	
8								3
4								1
0x=0			$1+x=1$					
$xx=x$			$x+x=x$					
$xx=0$			$x+\bar{x}=1$					
$xy=yx$			$x+y=y+x$					
$(xy)z=x(yz)$			$(x+y)+z=x+(y+z)$					
$(xy)z=(x+y)(xz)$			$(x+y)+z=xy+xz$					
$x+yz=(x+y)(x+z)$			$x+xy=x$					
$x(x+y)=x$							5	
							8	7
								9

Formal verification  
Proves the sequence correct  
Slow

# Superoptimization fundamentals: Costing

# Superoptimization fundamentals: Costing

Which sequence is the best?

# Superoptimization fundamentals: Costing

Which sequence is the best?

Execution time



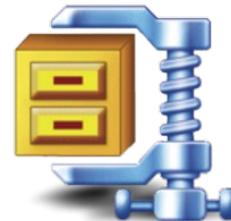
# Superoptimization fundamentals: Costing

Which sequence is the best?

Execution time



Code size



# Superoptimization fundamentals: Costing

Which sequence is the best?

Execution time



Code size



Energy consumption



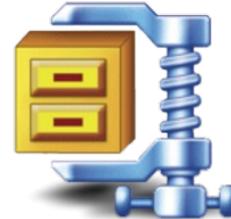
# Superoptimization fundamentals: Costing

Which sequence is the best?

Execution time



Code size



Energy consumption



If you can enumerate the instructions in cost order, the first correct sequence is the optimal sequence.

# Plan for today

What is superoptimization?



*Latest developments*



The GNU Superoptimizer



# Search space pruning

# Search space pruning

## Restrict parameters

- Registers
  - 50% of instruction sequences of length 8 use less than 4 registers
- Immediate constants
  - Frequently used constants: -16 to +16,  $2^n$ ,  $2^{n-1}$

# Search space pruning

## Restrict parameters

- Registers
  - 50% of instruction sequences of length 8 use less than 4 registers
- Immediate constants
  - Frequently used constants: -16 to +16,  $2^n$ ,  $2^n-1$

## Remove meaningless constructs

- `mov r0, r0`
- `add r0, r0, #0`

# Search space pruning

## Restrict parameters

- Registers
  - 50% of instruction sequences of length 8 use less than 4 registers
- Immediate constants
  - Frequently used constants: -16 to +16,  $2^n$ ,  $2^{n-1}$

## Remove meaningless constructs

- `mov r0, r0`
- `add r0, r0, #0`

## Canonical form

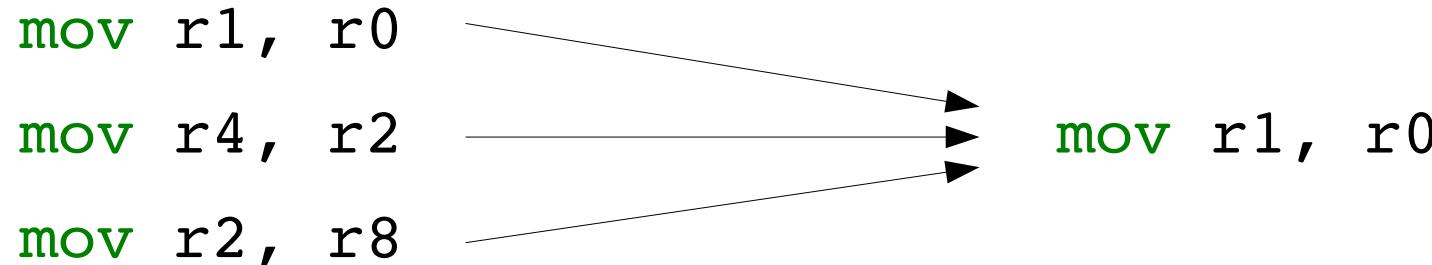
# Canonical form

`mov r1, r0` has many equivalent versions

# Canonical form

`mov r1, r0` has many equivalent versions

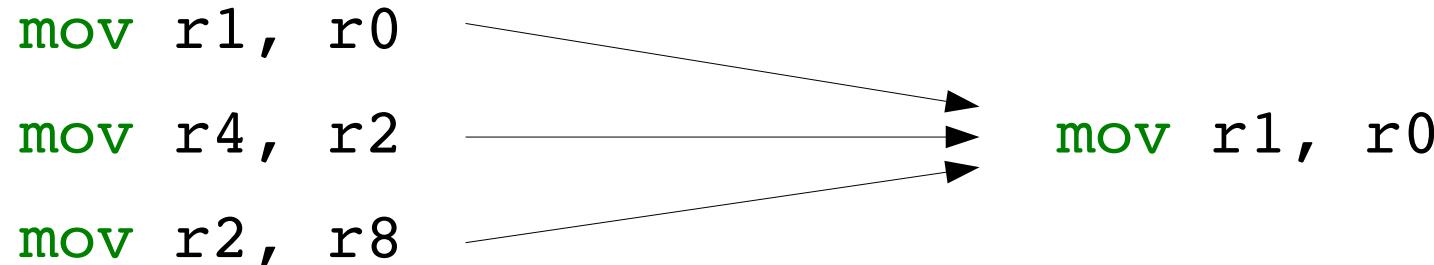
Rename each register so they appear in sequence:



# Canonical form

`mov r1, r0` has many equivalent versions

Rename each register so they appear in sequence:



With 16 registers this replaces  $16 \times 15$  equivalent versions

# Canonical form

```
add r4, r8, r1          add r2, r1, r0
orr r8, r4, #1          orr r1, r2, #1
sub r1, r2, #8          sub r0, r3, #8
```

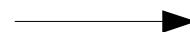
# Canonical form

```
add r4, r8, r1          add r2, r1, r0
orr r8, r4, #1          orr r1, r2, #1
sub r1, r2, #8          sub r0, r3, #8
```

Single three operand  
instruction:

add rx, rx, rx

5 unique forms



```
add r0, r0, r0
add r0, r0, r1
add r0, r1, r0
add r0, r1, r1
add r0, r1, r2
```

# Canonical form – reduction

# Canonical form – reduction

## Data processing instructions

- 16 ops, each using 3 of 16 possible registers.
- E.g.      **add r0, r1, r2**  
                **sub r3, r4, r5**

# Canonical form – reduction

## Data processing instructions

- 16 ops, each using 3 of 16 possible registers.
- E.g.      **add r0, r1, r2**  
**sub r3, r4, r5**

Instructions	Normal	Canonical	Canonical (4 registers)
1	65,536	80	80
2	4,294,967,296	51,968	47,872
3	281,474,976,710,656	4,157,669,376	45,264,896
4	18,446,744,073,709,551,616	276,142,292,992	45,880,115,200

# Canonical form – reduction

## Data processing instructions

- 16 ops, each using 3 of 16 possible registers.
- E.g.     **add r0, r1, r2**  
             **sub r3, r4, r5**

Instructions	Normal	Canonical	Canonical (4 registers)
1	65,536	80	80
2	4,294,967,296	51,968	47,872
3	281,474,976,710,656	4,157,669,376	45,264,896
4	18,446,744,073,709,551,616	276,142,292,992	45,880,115,200

@200,000 tests/second      2.9 million years

# Canonical form – reduction

## Data processing instructions

- 16 ops, each using 3 of 16 possible registers.
- E.g.      **add r0, r1, r2**  
**sub r3, r4, r5**

Instructions	Normal	Canonical	Canonical (4 registers)
1	65,536	80	80
2	4,294,967,296	51,968	47,872
3	281,474,976,710,656	4,157,669,376	45,264,896
4	18,446,744,073,709,551,616	276,142,292,992	45,880,115,200

@200,000 tests/second      2.9 million years      16 days

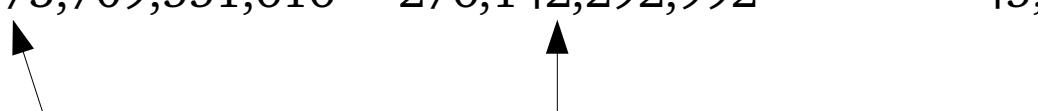
# Canonical form – reduction

## Data processing instructions

- 16 ops, each using 3 of 16 possible registers.
- E.g.     **add r0, r1, r2**  
             **sub r3, r4, r5**

Instructions	Normal	Canonical	Canonical (4 registers)
1	65,536	80	80
2	4,294,967,296	51,968	47,872
3	281,474,976,710,656	4,157,669,376	45,264,896
4	18,446,744,073,709,551,616	276,142,292,992	45,880,115,200

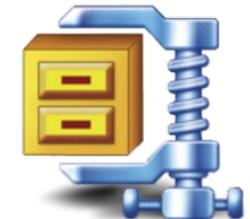
@200,000 tests/second      2.9 million years      16 days      <3 days



# Instruction costing

# Instruction costing

Sequence cost is simple if code size is to be minimised



# Instruction costing

Sequence cost is simple if code size is to be minimised



Difficult to accurately measure the performance of short sequences of instructions.



- Pipeline modelling
- Cycle accurate simulation

# Instruction costing

Sequence cost is simple if code size is to be minimised



Difficult to accurately measure the performance of short sequences of instructions.

- Pipeline modelling
- Cycle accurate simulation



Energy

- Total Software Energy and Reporting (TSERO)



# Instruction sets

# Instruction sets

Characteristics of the instruction set affect how well a superoptimizer will perform.

# Instruction sets

Characteristics of the instruction set affect how well a superoptimizer will perform.

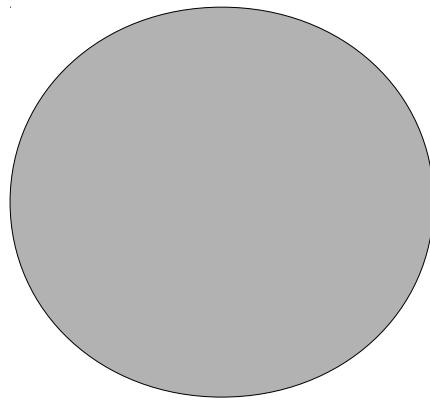
Smaller instruction set → fewer optimal sequences (?)

# Instruction sets

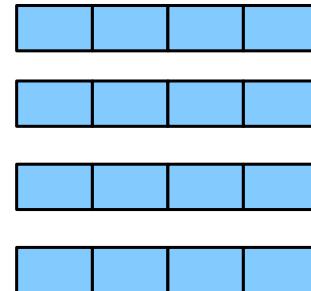
Characteristics of the instruction set affect how well a superoptimizer will perform.

Smaller instruction set → fewer optimal sequences (?)

Large instruction set



Many short sequences

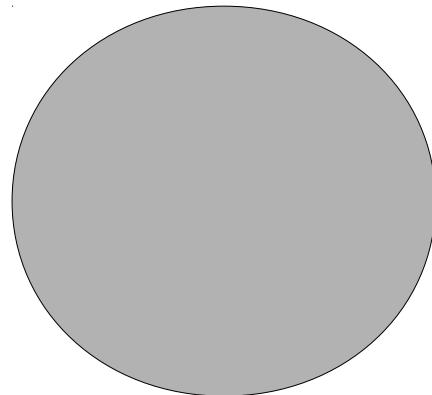


# Instruction sets

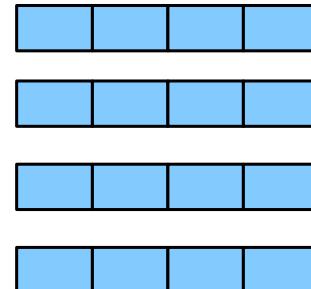
Characteristics of the instruction set affect how well a superoptimizer will perform.

Smaller instruction set → fewer optimal sequences (?)

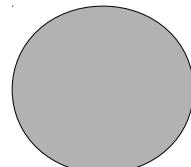
Large instruction set



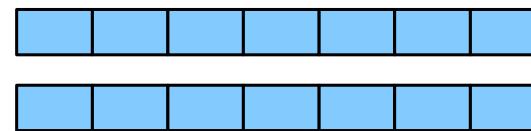
Many short sequences



Small instruction set



Few longer sequences

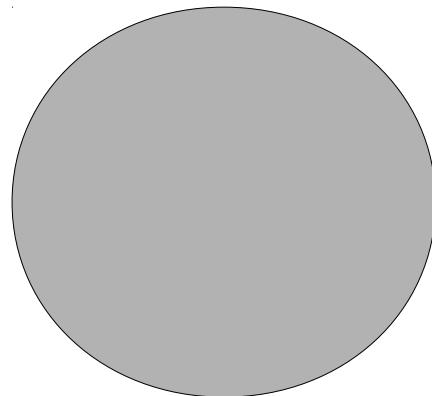


# Instruction sets

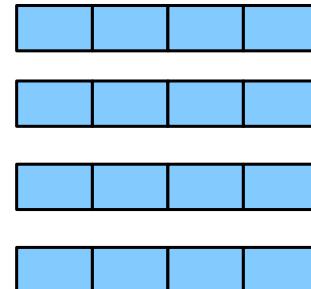
Characteristics of the instruction set affect how well a superoptimizer will perform.

Smaller instruction set → fewer optimal sequences (?)

Large instruction set

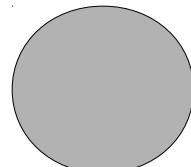


Many short sequences

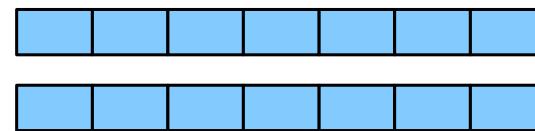


*Hard for standard compilers*

Small instruction set



Few longer sequences

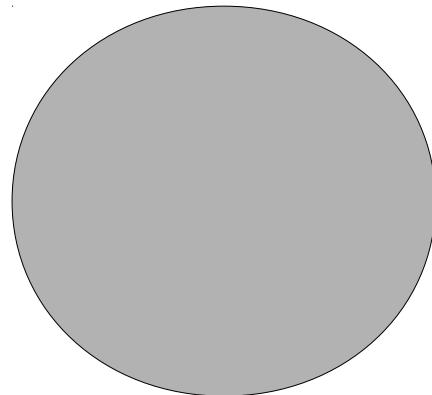


# Instruction sets

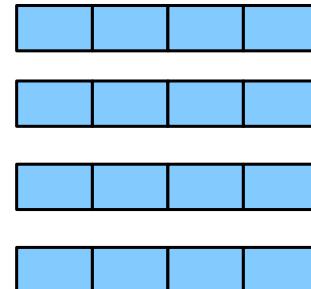
Characteristics of the instruction set affect how well a superoptimizer will perform.

Smaller instruction set → fewer optimal sequences (?)

Large instruction set

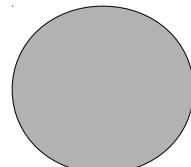


Many short sequences

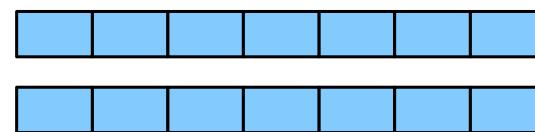


*Hard for standard compilers*

Small instruction set



Few longer sequences



*Easier for standard compilers*

# Superoptimizers

# Superoptimizers

## GNU SuperOptimizer (GSO)

# Superoptimizers

GNU SuperOptimizer (GSO)

Denali

# Superoptimizers

GNU SuperOptimizer (GSO)

Denali

Peephole Superoptimizer

# Superoptimizers

GNU SuperOptimizer (GSO)

Denali

Peephole Superoptimizer

Stochastic Superoptimization

# Superoptimizers

GNU SuperOptimizer (GSO)

Denali

Peephole Superoptimizer

Stochastic Superoptimization

Other

- A Hacker's Assistant (similar to GSO)
- TOAST (similar to Denali)

# GNU SuperOptimizer

Focuses on elimination of short basic blocks

Granlund, T., & Kenner, R. (1992). Eliminating branches using a superoptimizer and the GNU C compiler. PLDI '92 Proceedings of the ACM SIGPLAN 1992 conference on Programming language design and implementation.

# GNU SuperOptimizer

Focuses on elimination of short basic blocks

```
unsigned a, b, c;
```

```
if(a < b)  
    c++;
```



```
cmp    eax, ebx  
jge   L1  
add    ecx, #1  
L1:  
...
```

Granlund, T., & Kenner, R. (1992). Eliminating branches using a superoptimizer and the GNU C compiler. PLDI '92 Proceedings of the ACM SIGPLAN 1992 conference on Programming language design and implementation.

# GNU SuperOptimizer

Focuses on elimination of short basic blocks

```
unsigned a, b, c;
```

```
if(a < b)  
    c++;
```

```
c = (a < b) + c;
```

```
cmp    eax, ebx  
jge   L1  
add    ecx, #1  
L1:  
...  
  
subl    eax, edx  
adcl    ecx, #0
```

Granlund, T., & Kenner, R. (1992). Eliminating branches using a superoptimizer and the GNU C compiler. PLDI '92 Proceedings of the ACM SIGPLAN 1992 conference on Programming language design and implementation.

# Denali

5	3		7					
6			1	9	5			
	9	8						6
8								
4								
0x = 0			1+x = 1					3
xx = x			x+x = x					
x <bar>x} = 0</bar>			x+ <bar>x} = 1</bar>					1
xy = yx			x+y = y+x					
(xy)z = x(yz)			(x+y)+z = x+(y+z)					6
(xy)z = (x+y)(x+z)			(x+y)z = xy+xz					
x+yz = (x+y)(x+z)			x(y+z) = xy+xz					
x+yz = x			x+xy = x					5
x(x+y) = x								
	8							7 9

Joshi, R., Nelson, G., & Randall, K. (2001). Denali : a goal-directed superoptimizer. Proceedings of the ACM 2000 Conference on Programming Language Design and Implementation (pp. 304–314).

# Denali

Rule based program generation:

5	3		7					
6			1	9	5			
	9	8						6
8								
4								
0x = 0			1+x = 1					3
xx = x			x+x = x					
x <bar>x</bar>	= 0		x+ <bar>x</bar>	= 1				1
xy = yx			x+y = y+x					
(xy)z = x(yz)			(x+y)+z = x+(y+z)					6
(xy)z = (x+y)(x+z)			(x+y)z = xy+xz					
x+yz = (x+y)x+z			x(y+z) = xy+xz					
x+yz = x			x+xy = x					5
x(x+y) = x								
			8				7	9

Joshi, R., Nelson, G., & Randall, K. (2001). Denali : a goal-directed superoptimizer. Proceedings of the ACM 2000 Conference on Programming Language Design and Implementation (pp. 304–314).

# Denali

# Rule based program generation:

- Prove the condition: there exists no instruction sequence that solves  $F(x)$  in  $< K$  cycles

5	3			7				
6			1	9	5			
	9	8					6	
8								3
4								1
$0x = 0$			$1+x = 1$					
$xx = x$			$x+x = x$					
$x\bar{x} = 0$			$x+\bar{x} = 1$					
$xy = yx$			$x \cdot y = y \cdot x$					
$(xy)z = x(yz)$			$(x+y)+z = x+(y+z)$					
$x-yz = (x-y)(x+z)$			$x(y+z) = xy+xz$					
$x(x+y) = x$			$x+xy = x$					
			8		7	9		

Joshi, R., Nelson, G., & Randall, K. (2001). Denali : a goal-directed superoptimizer. Proceedings of the ACM 2000 Conference on Programming Language Design and Implementation (pp. 304–314).

# Denali

## Rule based program generation:

- Prove the condition: there exists no instruction sequence that solves  $F(x)$  in  $< K$  cycles
- Failure yields an example sequence

5	3		7					
6			1	9	5			
	9	8						6
8								
4								
0x = 0			1+x = 1					
xx = x			x+x = x					
x̄x = 0			x+̄x = 1					
xy = yx			x+y = y+x					
(xy)z = x(yz)			x+y+z = x+(y+z)					
(xy)z = (x+y)(x+z)			(x+y)+z = x+y+z					
x+yz = (x+y)x+z			x(y+z) = xy+xz					
x+yz = x			x+xy = x					
x(x+y) = x							5	
							8	
								7
								9

Joshi, R., Nelson, G., & Randall, K. (2001). Denali : a goal-directed superoptimizer. Proceedings of the ACM 2000 Conference on Programming Language Design and Implementation (pp. 304–314).

# Denali

# Rule based program generation:

- Prove the condition: there exists no instruction sequence that solves  $F(x)$  in  $< K$  cycles
  - Failure yields an example sequence
  - Use hand-written transformation rules

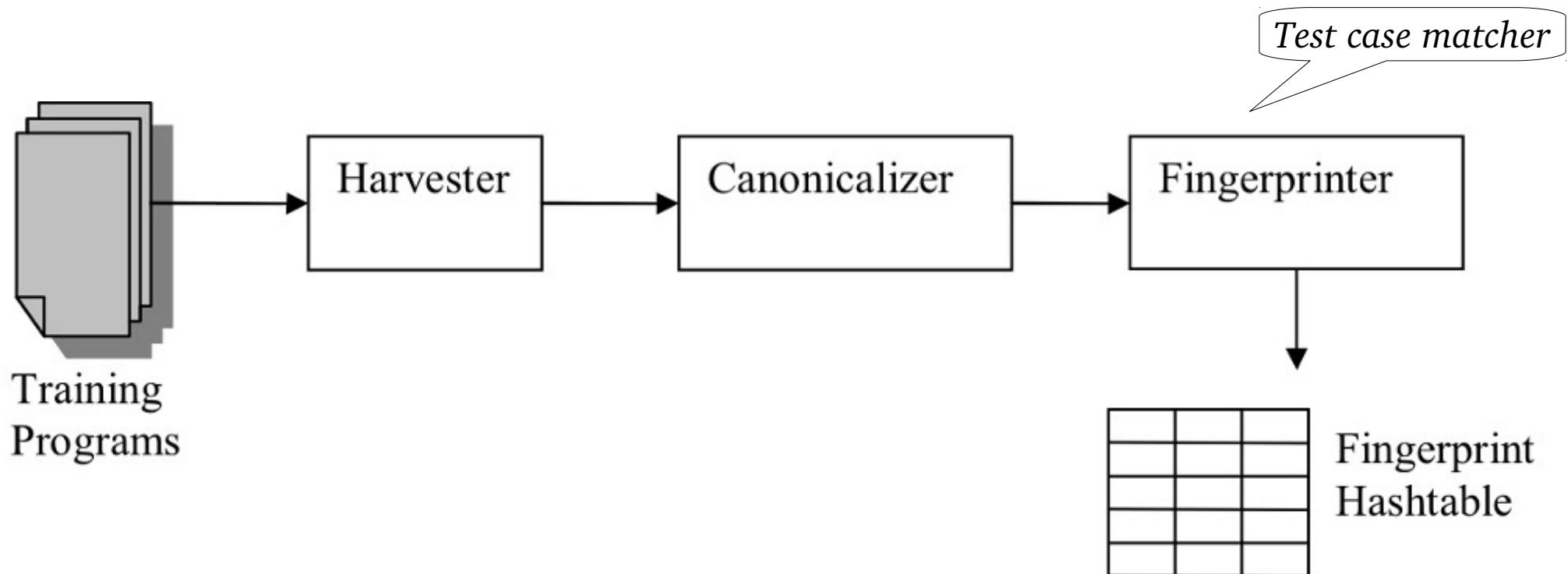
$x * 2 \leftrightarrow x \ll 1$   
 $a + b \leftrightarrow b + a$

5	3		7					
6			1	9	5			
	9	8					6	
8								3
4								1
0x = 0			$1+x = 1$					
$x+x = x$			$x+x = x$					
$x+x = 1$			$x+x = 1$					
$xy = yx$			$x+y = y+x$					
$(xy)z = x(yz)$			$(x+y)+z = x+(y+z)$					
$x+yz = (x+y)(x+z)$			$x(y+z) = xy+xz$					
$x(x+y) = x$			$x+xy = x$					
			8			5	7	9

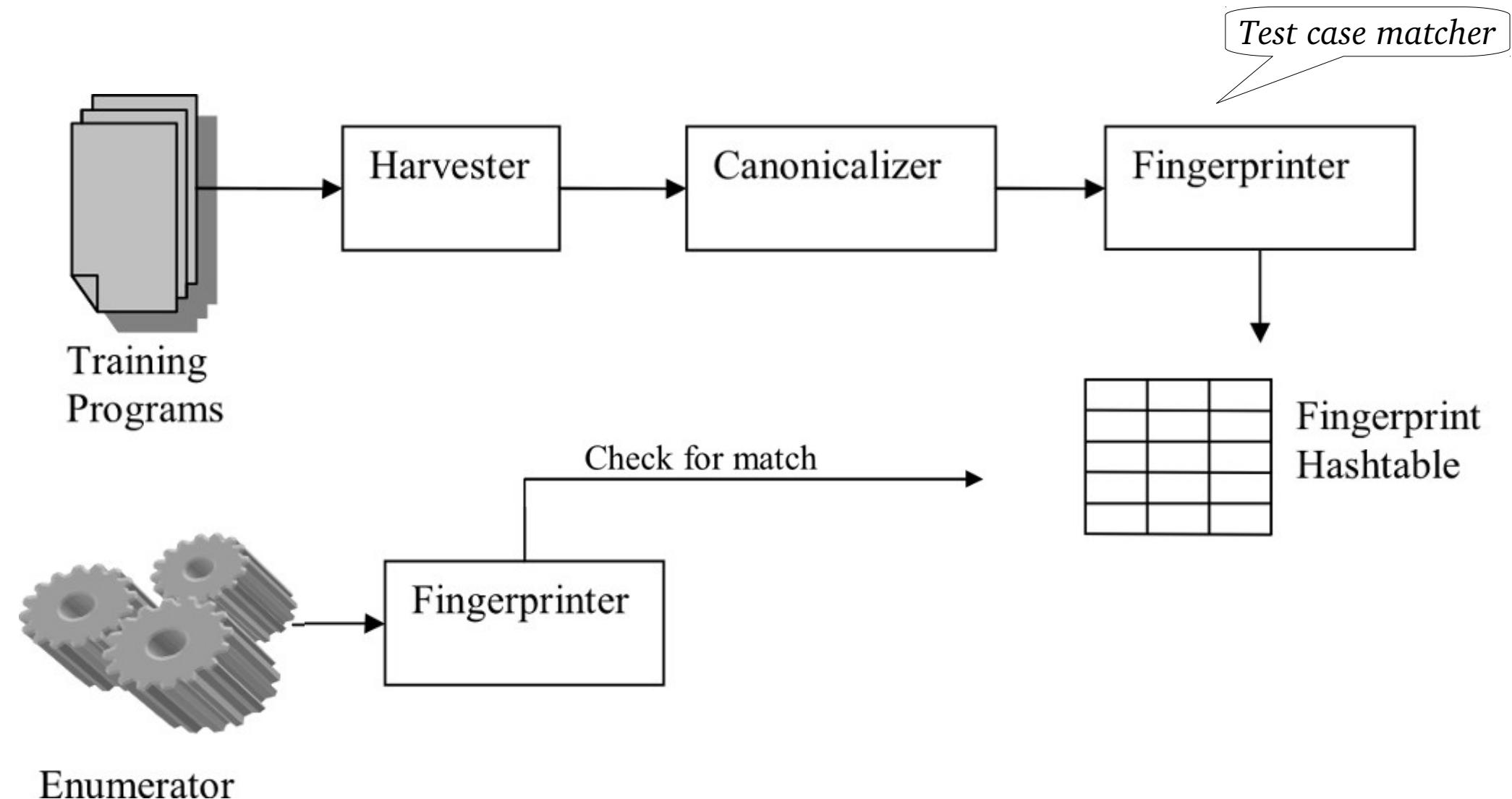
Joshi, R., Nelson, G., & Randall, K. (2001). Denali : a goal-directed superoptimizer. Proceedings of the ACM 2000 Conference on Programming Language Design and Implementation (pp. 304–314).

# Peephole Superoptimizers

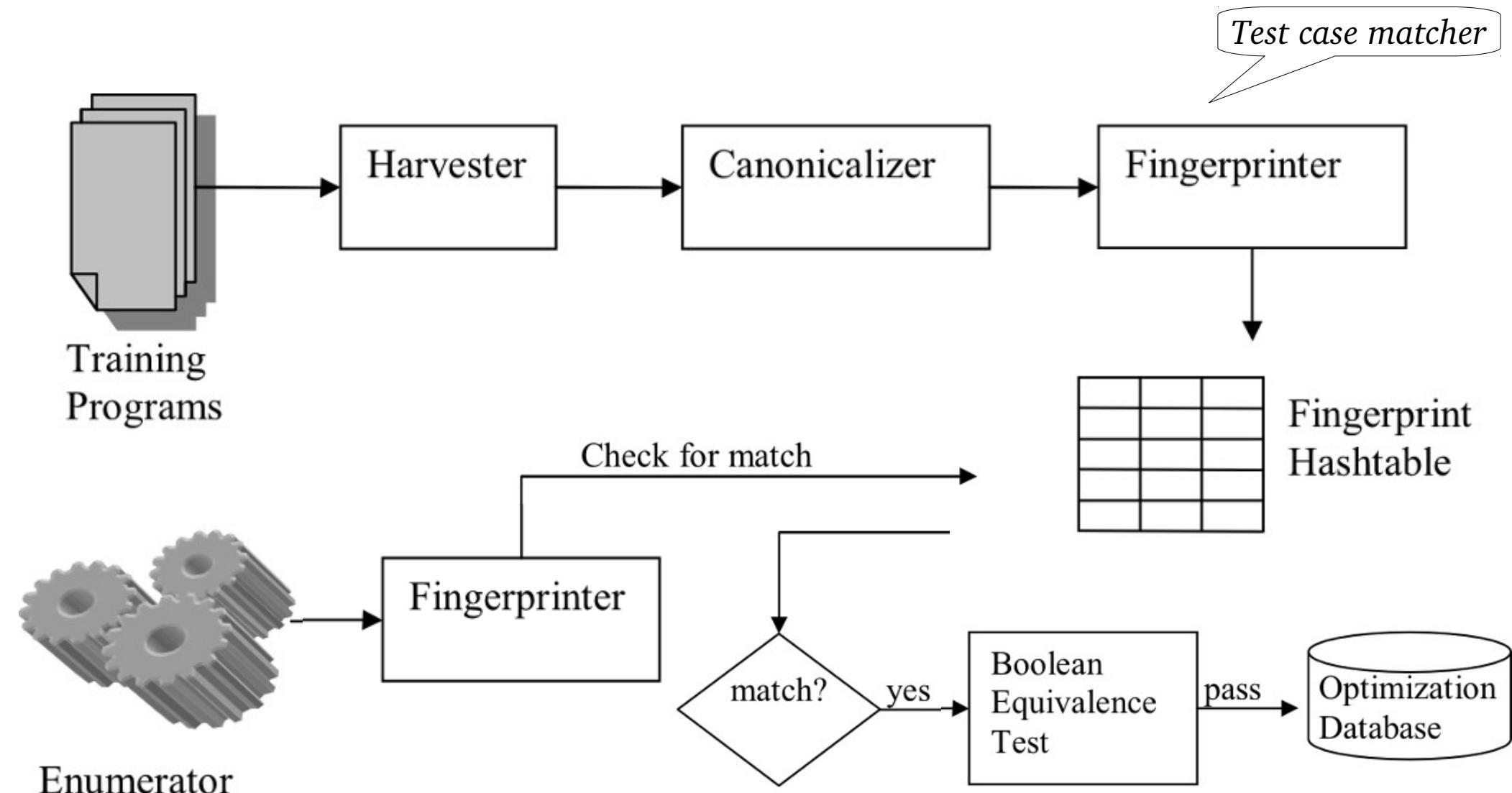
# Peephole Superoptimizers



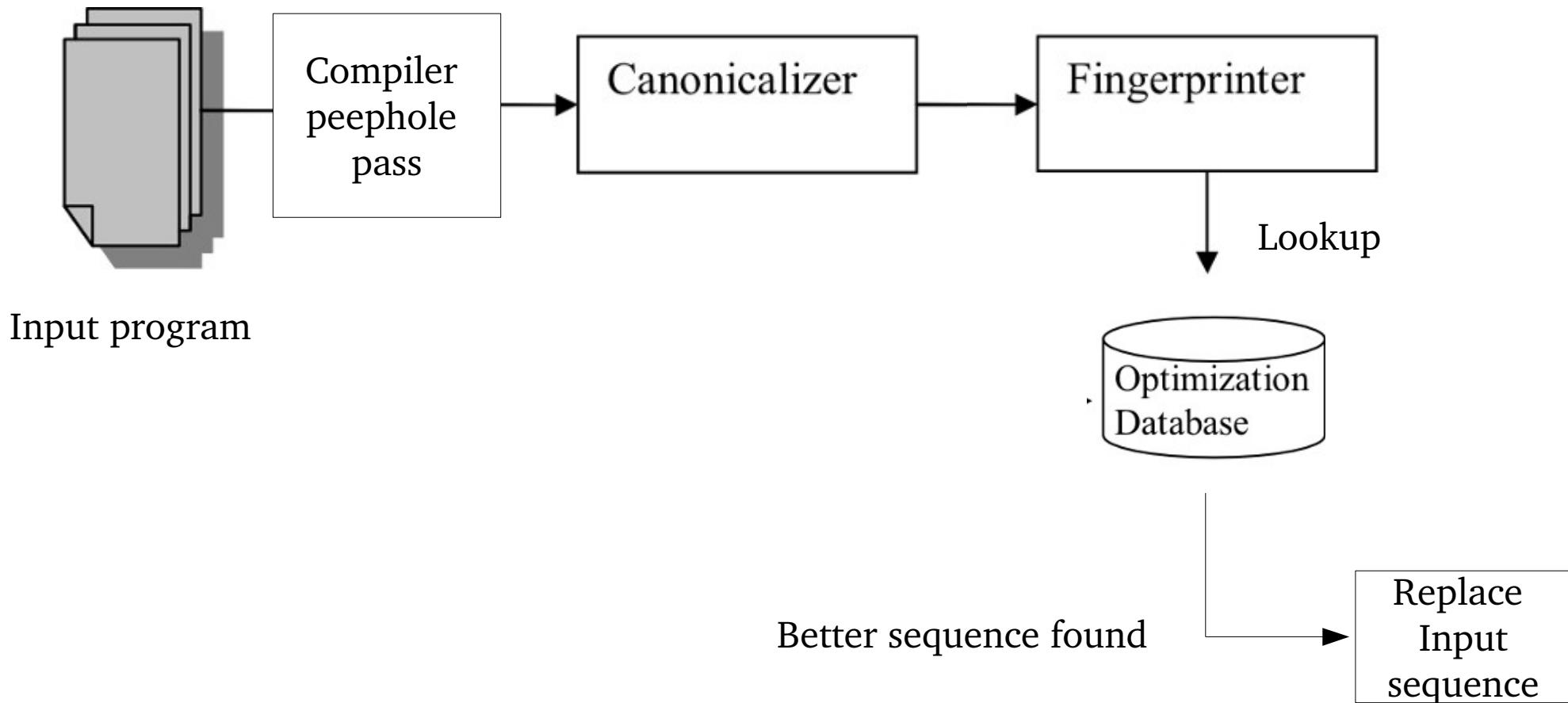
# Peephole Superoptimizers



# Peephole Superoptimizers



# Peephole Superoptimizers



# Stochastic superoptimization

Schkufza, E., Sharma, R., & Aiken, A. (2013). Stochastic superoptimization. *Architectural Support for Programming Languages and Operating Systems*, 305.

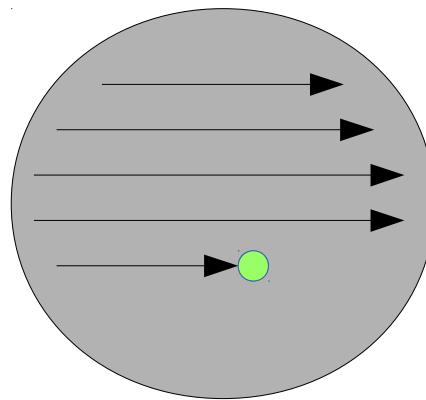
# Stochastic superoptimization

A different approach to instruction sequence enumeration

Schkufza, E., Sharma, R., & Aiken, A. (2013). Stochastic superoptimization. *Architectural Support for Programming Languages and Operating Systems*, 305.

# Stochastic superoptimization

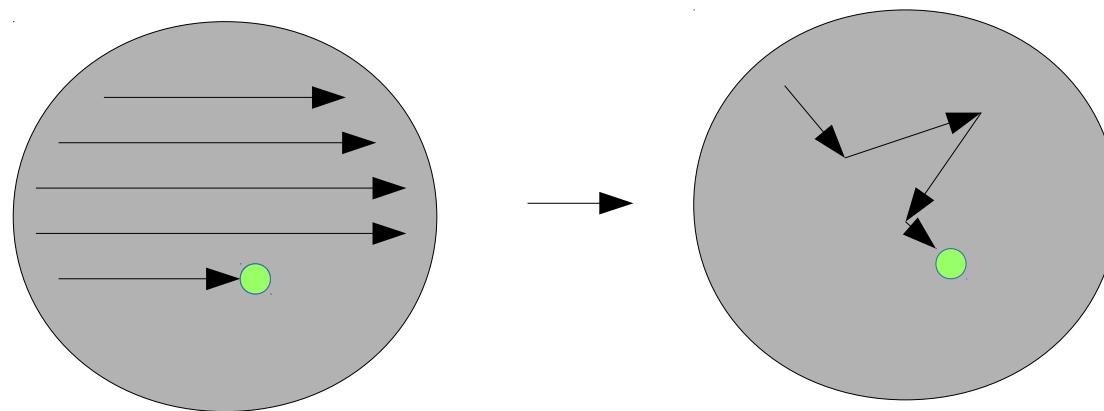
A different approach to instruction sequence enumeration



Schkufza, E., Sharma, R., & Aiken, A. (2013). Stochastic superoptimization. *Architectural Support for Programming Languages and Operating Systems*, 305.

# Stochastic superoptimization

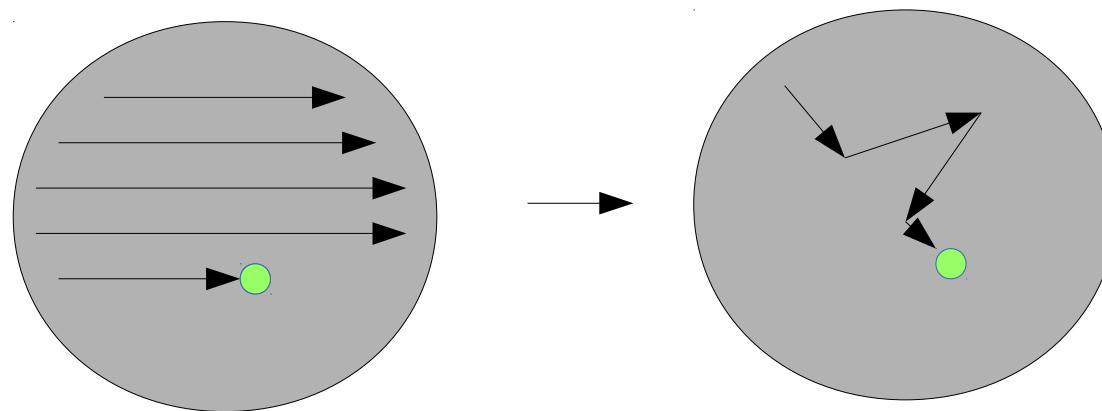
A different approach to instruction sequence enumeration



Schkufza, E., Sharma, R., & Aiken, A. (2013). Stochastic superoptimization. *Architectural Support for Programming Languages and Operating Systems*, 305.

# Stochastic superoptimization

A different approach to instruction sequence enumeration



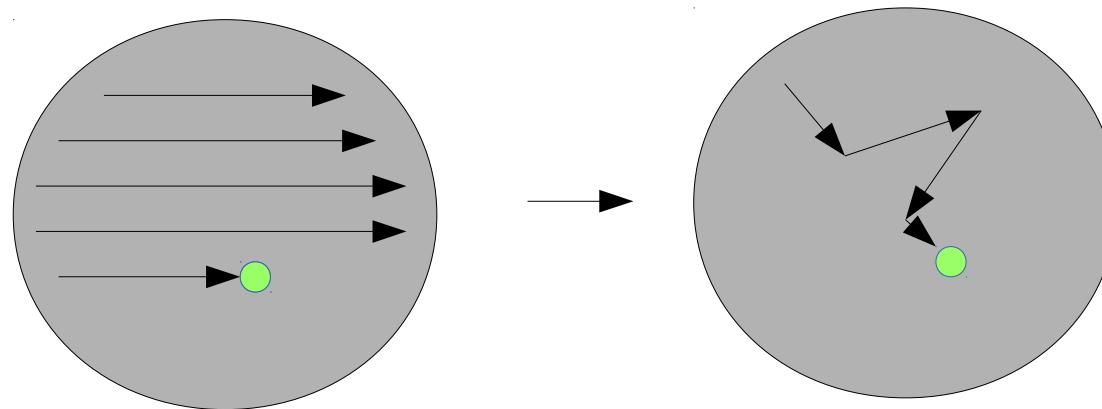
Longer sequences of instructions

- Sequences of  $> 14$  instructions were considered

Schkufza, E., Sharma, R., & Aiken, A. (2013). Stochastic superoptimization. *Architectural Support for Programming Languages and Operating Systems*, 305.

# Stochastic superoptimization

A different approach to instruction sequence enumeration



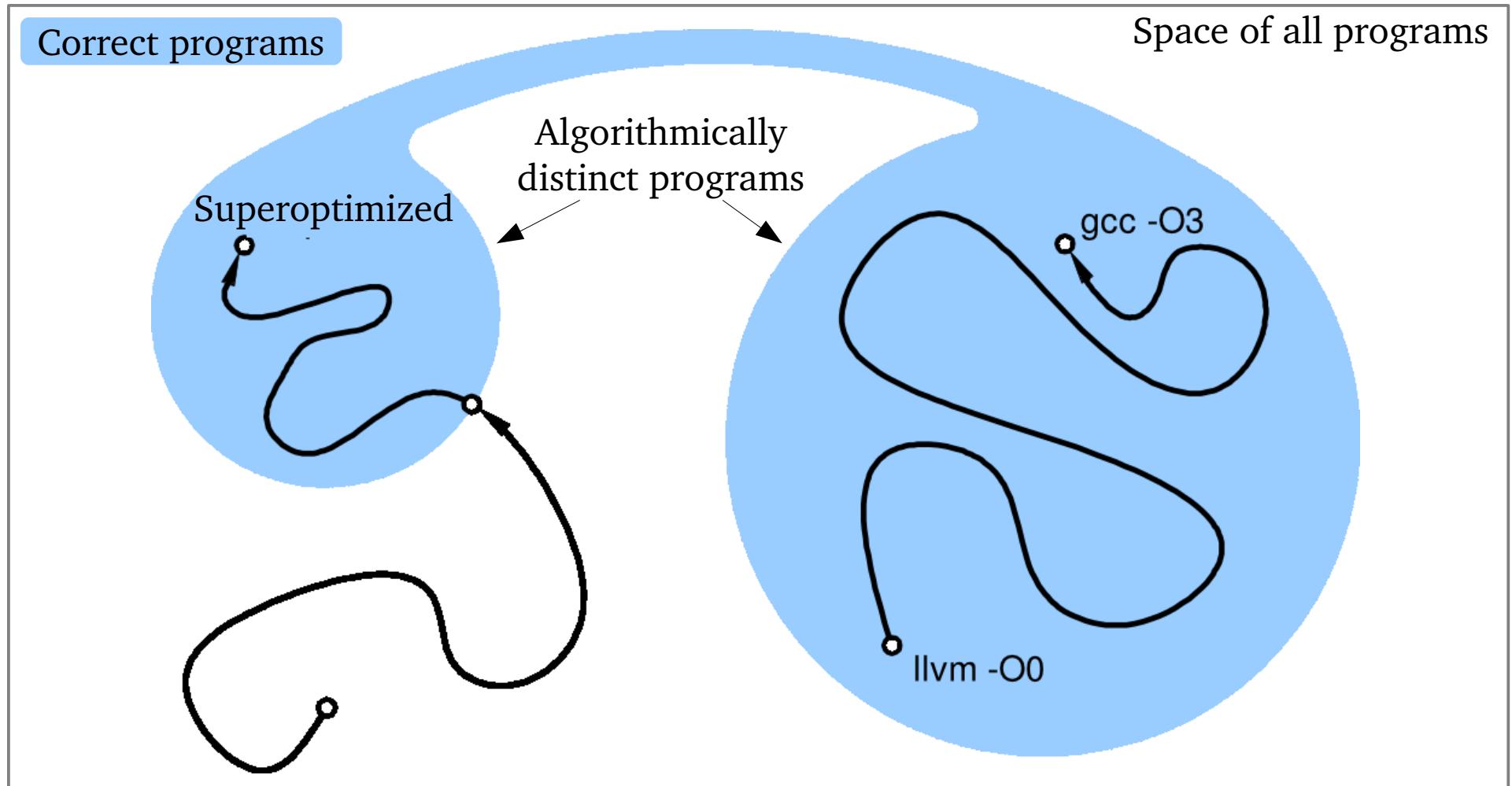
Longer sequences of instructions

- Sequences of >14 instructions were considered
- E.g. OpenSSL Montgomery multiplication 60% faster

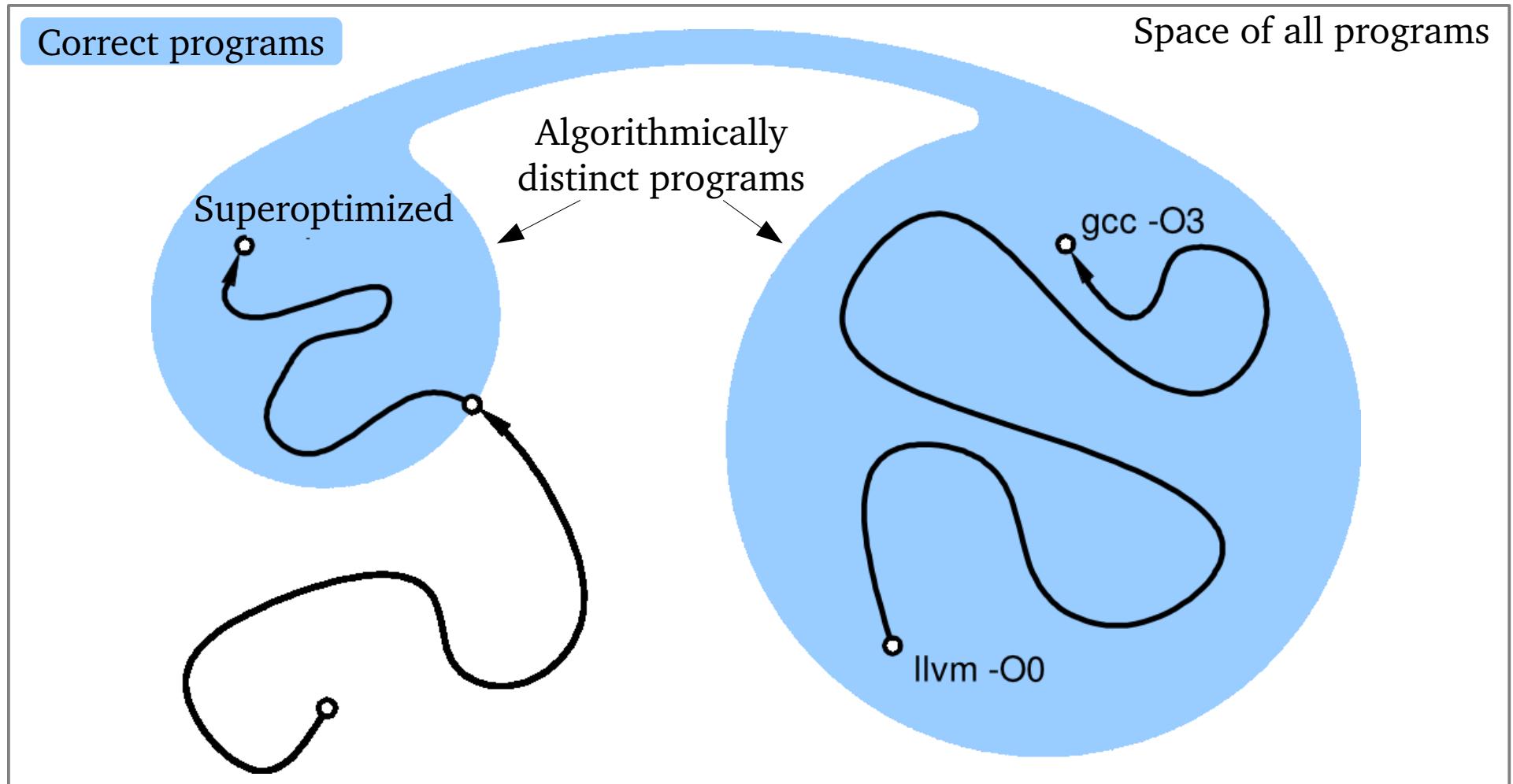
Schkufza, E., Sharma, R., & Aiken, A. (2013). Stochastic superoptimization. *Architectural Support for Programming Languages and Operating Systems*, 305.

# Discovering new algorithms

# Discovering new algorithms



# Discovering new algorithms



*Stochastic superoptimization's longer sequences make this more likely*

# Plan for today

What is superoptimization?



Latest developments



*The GNU SuperOptimizer*



# GSO: What can it do?

The sign function, AVR:

```
cp    r1, r24
brlt .+14
ldi   r25, 0x01
cpse r24, r1
rjmp .+2
ldi   r25, 0x00
mov   r24, r25
neg   r24
rjmp .+2
ldi   r24, 0x01
```

Compiler (-Os)

11 instructions

4-10 cycles (if r1 initialised to 0)

```
add  r0, r0
mov  r1, r0
sbc  r1, r0
sub  r1, r0
adc  r1, r0
```

Superoptimizer:

5 instructions

5 cycles

# How does it work?

Iterative deepening depth first search

1 instruction

# How does it work?

Iterative deepening depth first search

1 instruction

add r0, r0 → Check

# How does it work?

Iterative deepening depth first search

1 instruction

add r0, r0 → Check

sub r0, r0 → Check

# How does it work?

Iterative deepening depth first search

1 instruction

add r0, r0 → Check

sub r0, r0 → Check

mul r0, r0 → Check

# How does it work?

Iterative deepening depth first search  
2 instructions

# How does it work?

Iterative deepening depth first search

2 instructions

add r0, r0

# How does it work?

Iterative deepening depth first search

2 instructions

add r0, r0 → Check

# How does it work?

Iterative deepening depth first search

2 instructions

add r0, r0 → Check  
sub r0, r0 → Check

add r0, r0



# How does it work?

Iterative deepening depth first search

2 instructions

add r0, r0 → Check  
sub r0, r0 → Check  
mul r0, r0 → Check

# How does it work?

Iterative deepening depth first search

2 instructions

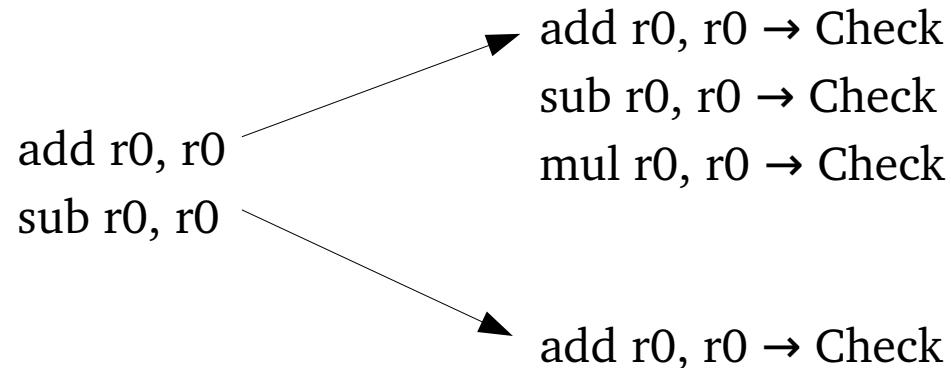
add r0, r0  
sub r0, r0

→ add r0, r0 → Check  
sub r0, r0 → Check  
mul r0, r0 → Check

# How does it work?

Iterative deepening depth first search

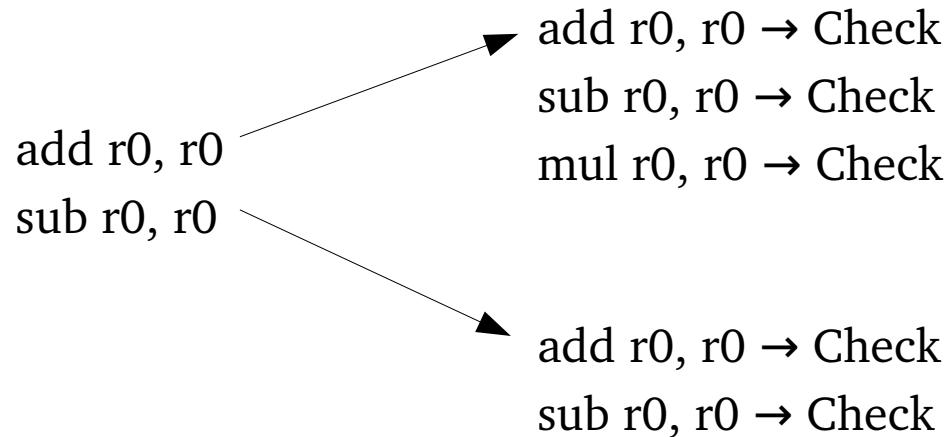
2 instructions



# How does it work?

## Iterative deepening depth first search

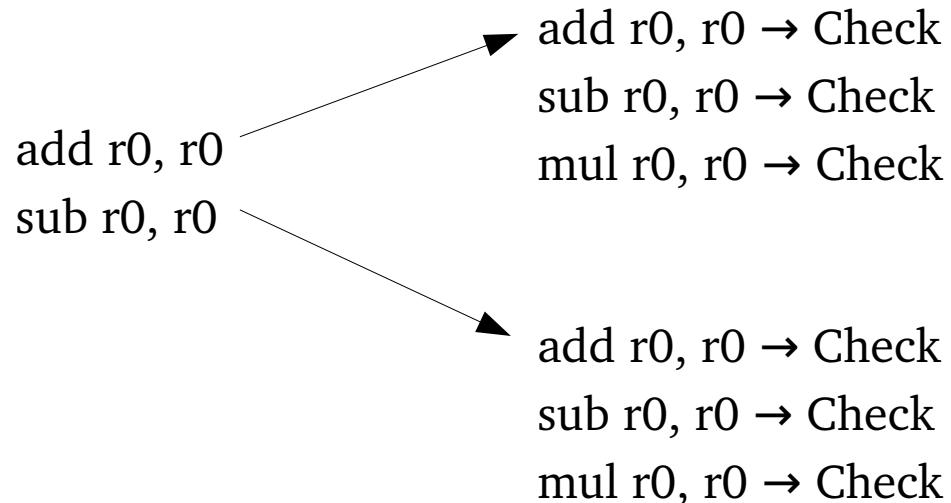
### 2 instructions



# How does it work?

## Iterative deepening depth first search

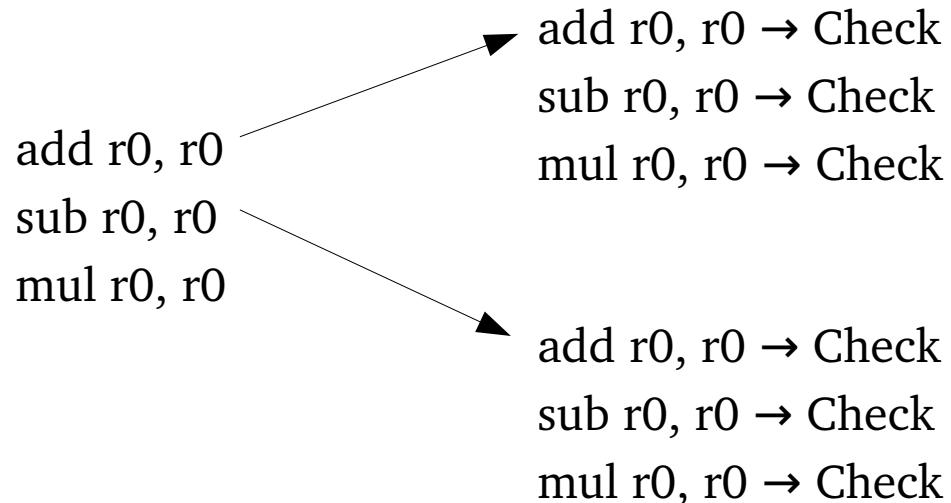
### 2 instructions



# How does it work?

## Iterative deepening depth first search

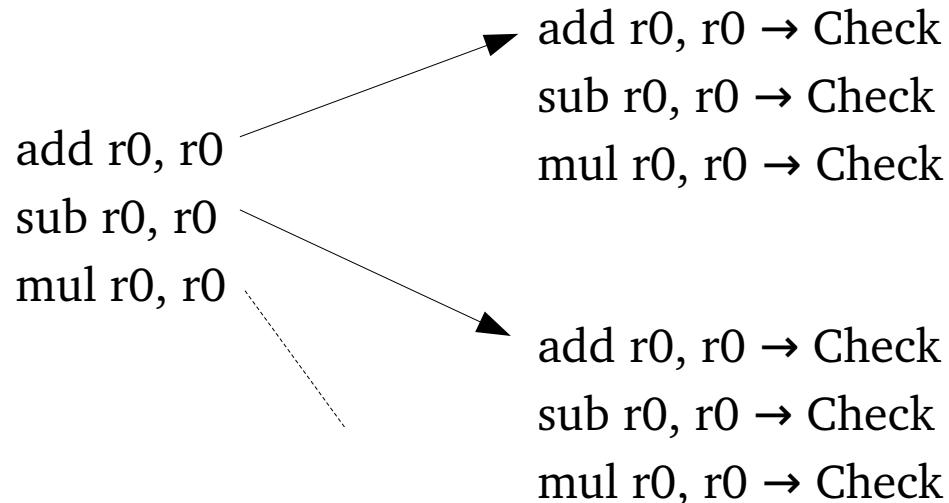
### 2 instructions



# How does it work?

## Iterative deepening depth first search

### 2 instructions



# How does it work?

Iterative deepening depth first search

3 instructions

# How does it work?

Iterative deepening depth first search

3 instructions

add r0, r0

# How does it work?

Iterative deepening depth first search

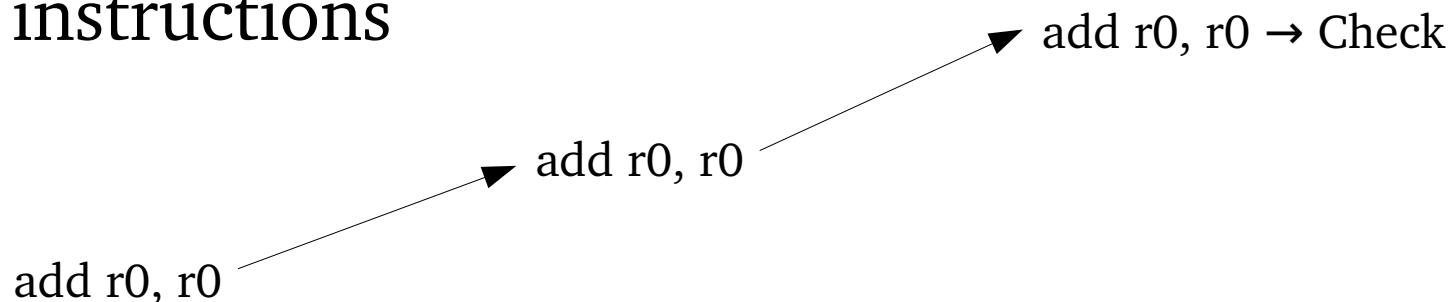
3 instructions

add r0, r0 → add r0, r0

# How does it work?

Iterative deepening depth first search

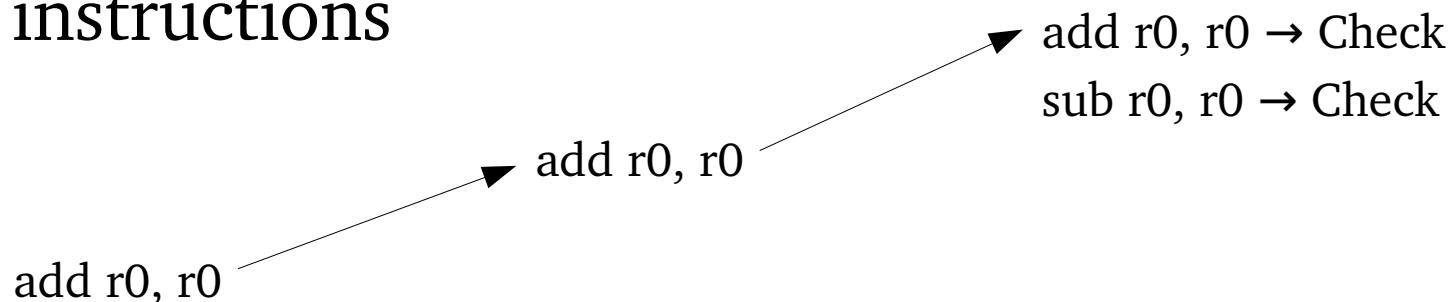
3 instructions



# How does it work?

## Iterative deepening depth first search

3 instructions



# How does it work?

## Iterative deepening depth first search

3 instructions

add r0, r0

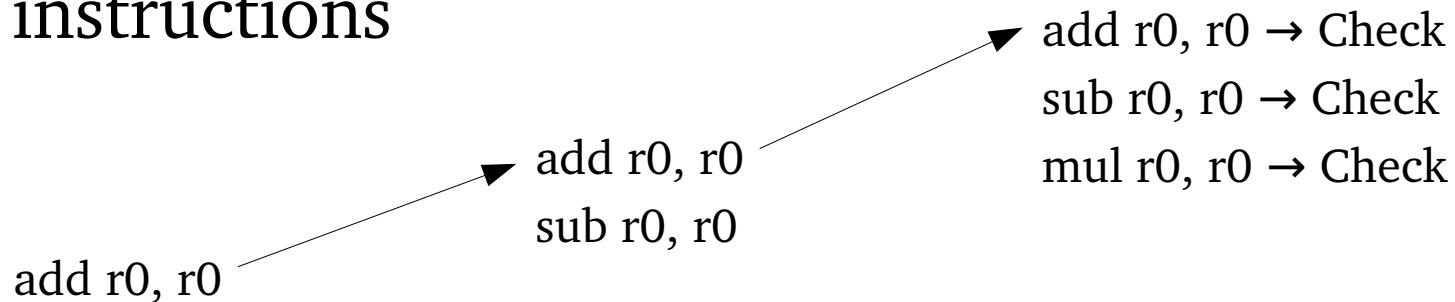
add r0, r0

add r0, r0 → Check  
sub r0, r0 → Check  
mul r0, r0 → Check

# How does it work?

## Iterative deepening depth first search

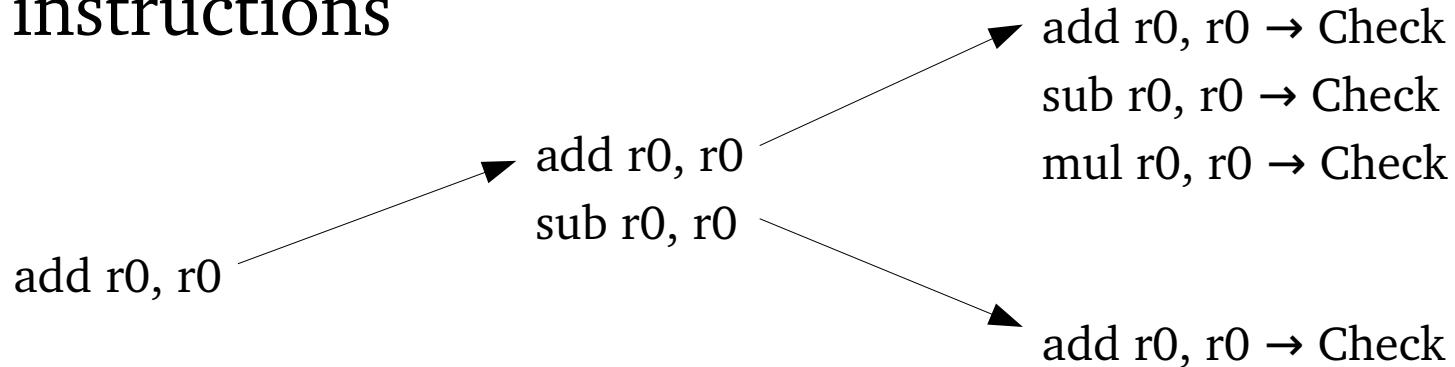
3 instructions



# How does it work?

## Iterative deepening depth first search

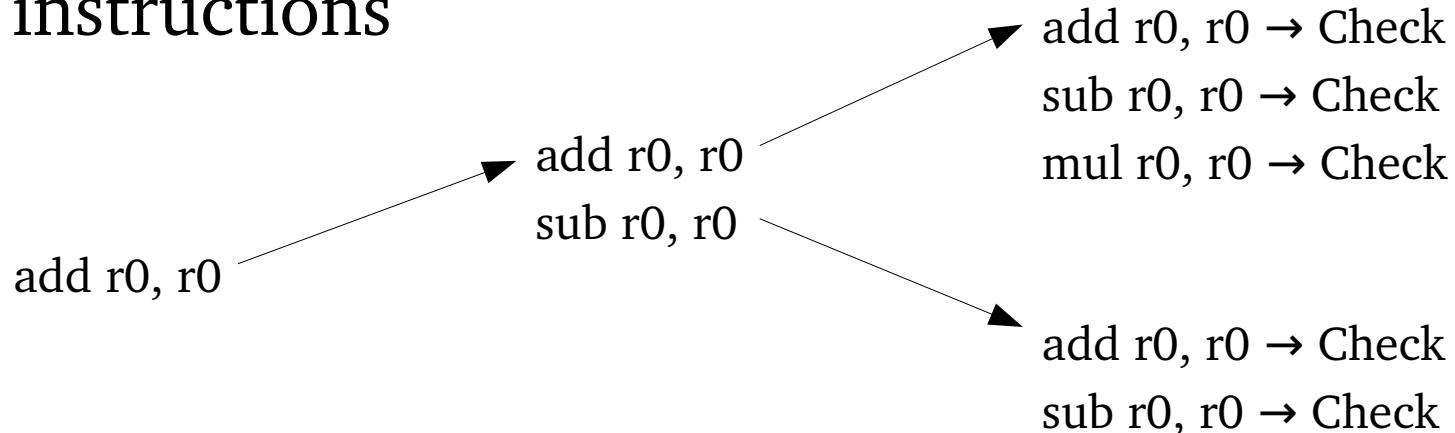
3 instructions



# How does it work?

## Iterative deepening depth first search

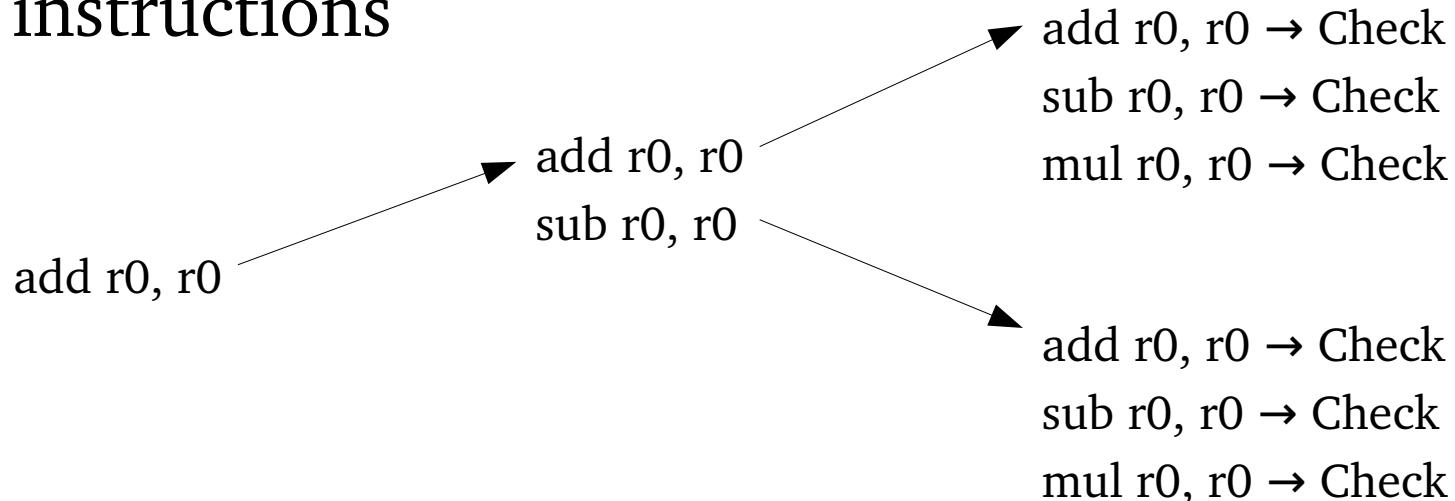
3 instructions



# How does it work?

## Iterative deepening depth first search

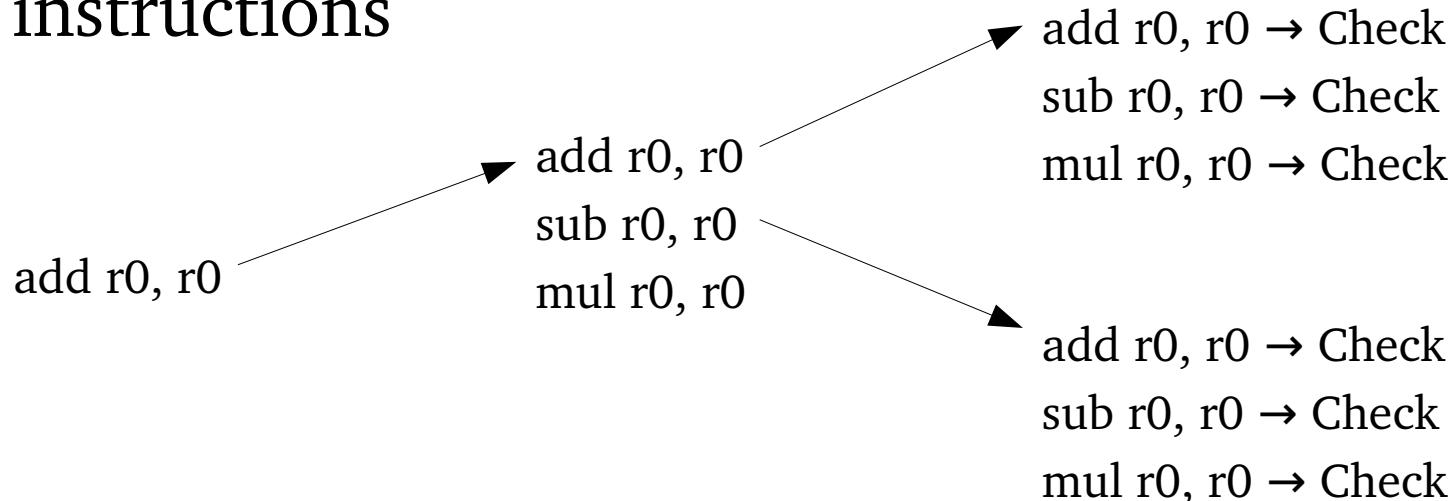
3 instructions



# How does it work?

## Iterative deepening depth first search

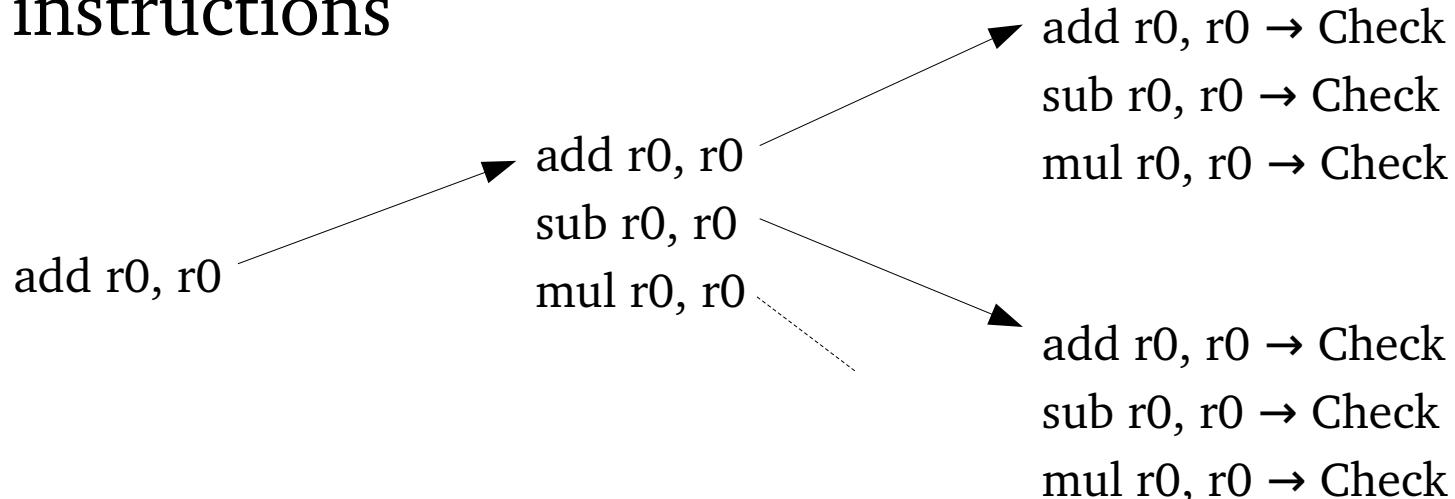
3 instructions



# How does it work?

## Iterative deepening depth first search

3 instructions

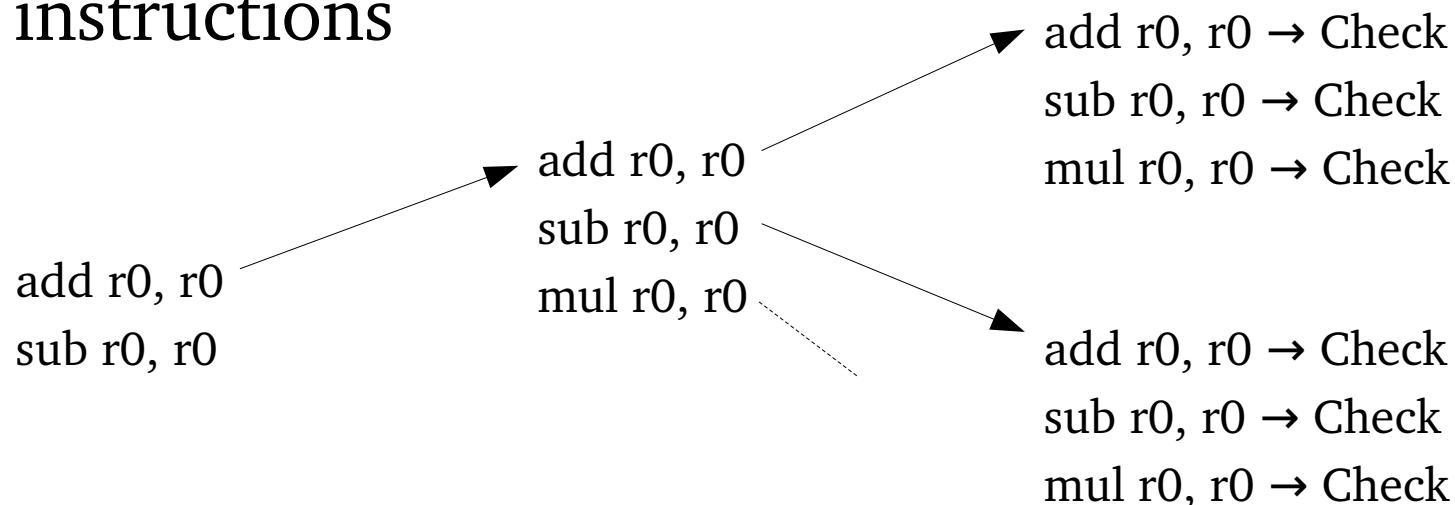


...

# How does it work?

## Iterative deepening depth first search

3 instructions

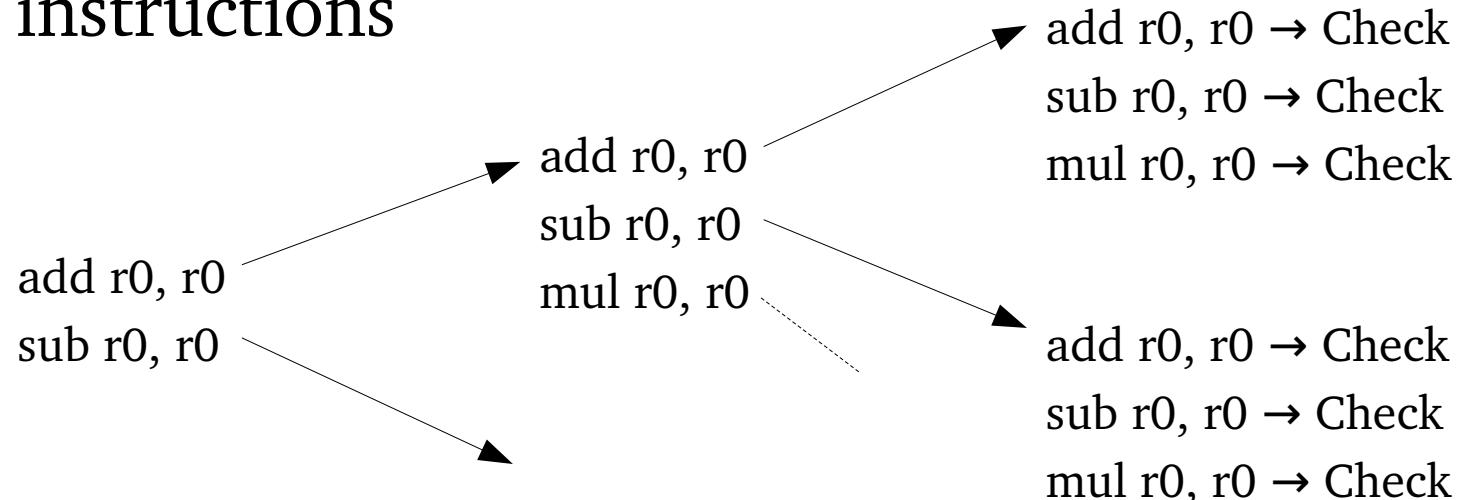


...

# How does it work?

## Iterative deepening depth first search

3 instructions

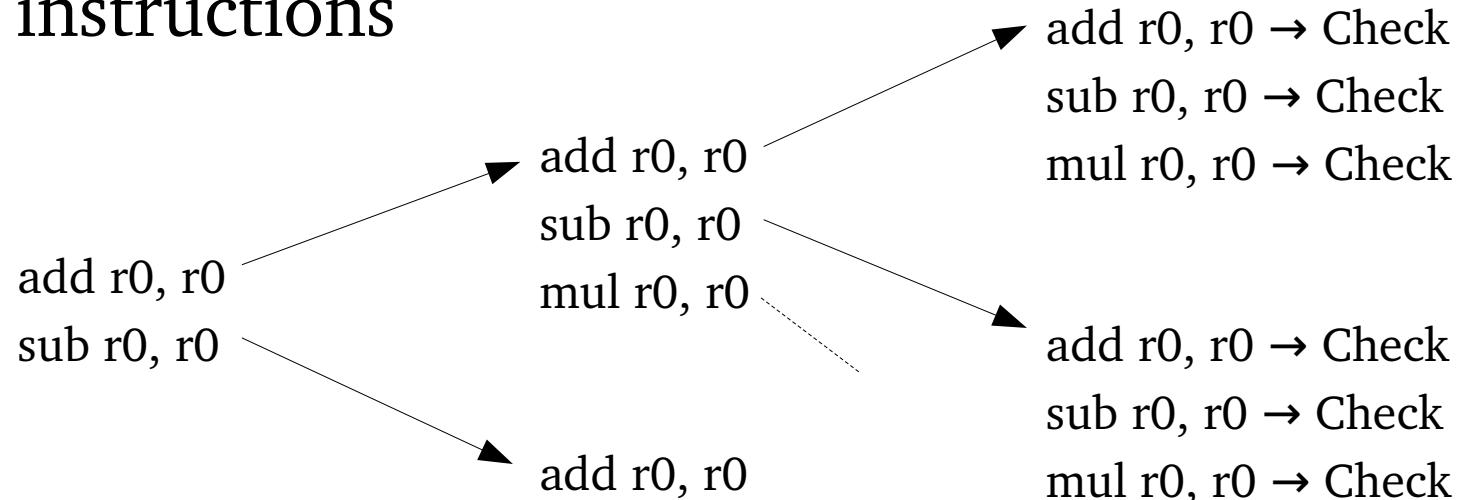


...

# How does it work?

## Iterative deepening depth first search

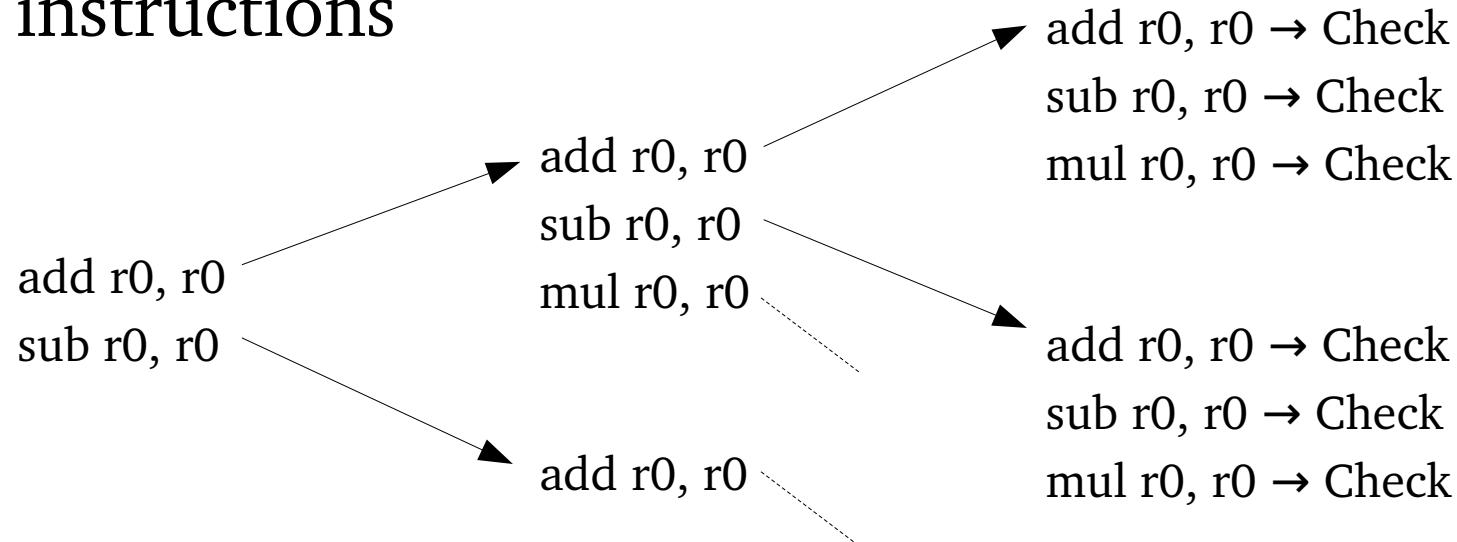
3 instructions



# How does it work?

## Iterative deepening depth first search

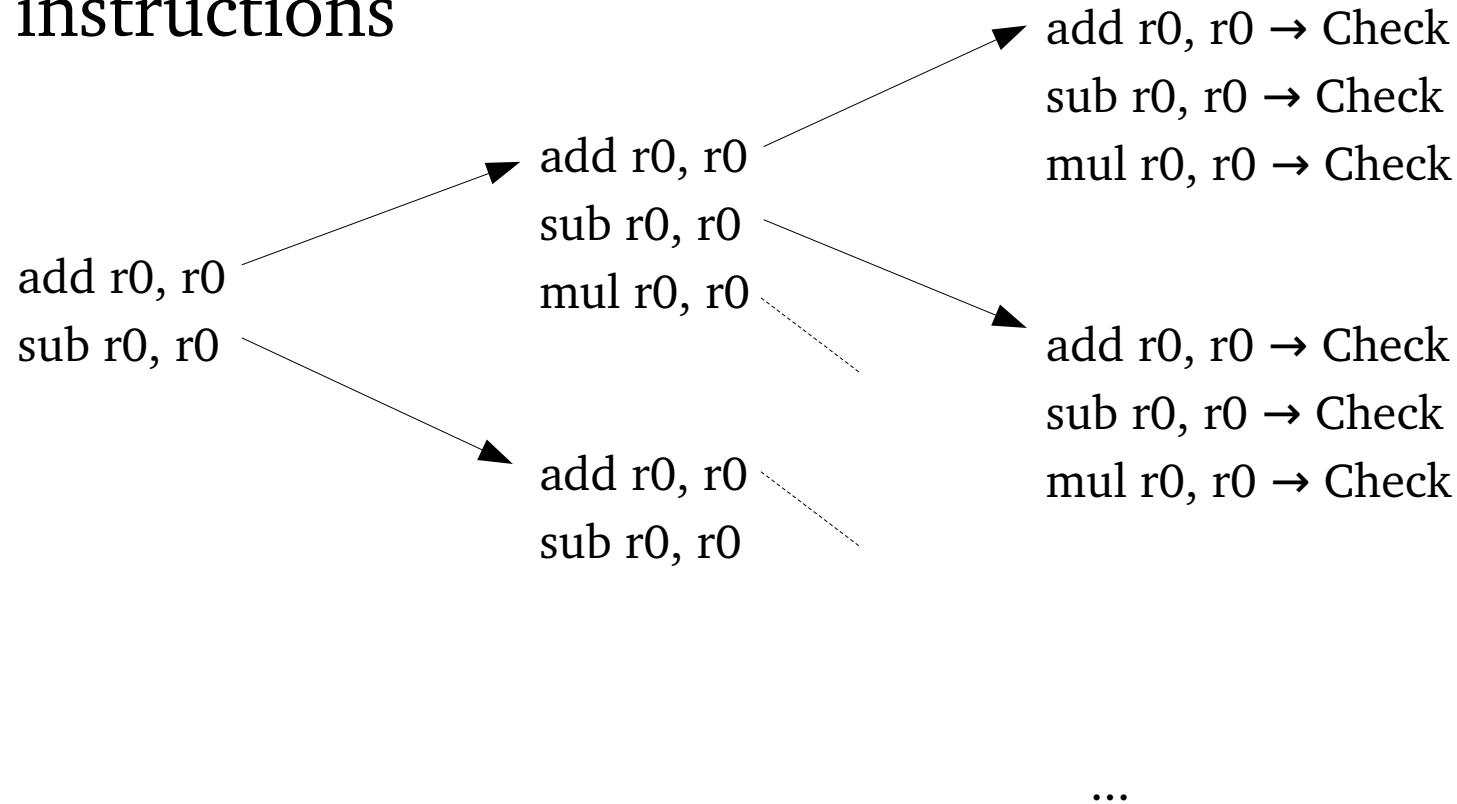
3 instructions



# How does it work?

## Iterative deepening depth first search

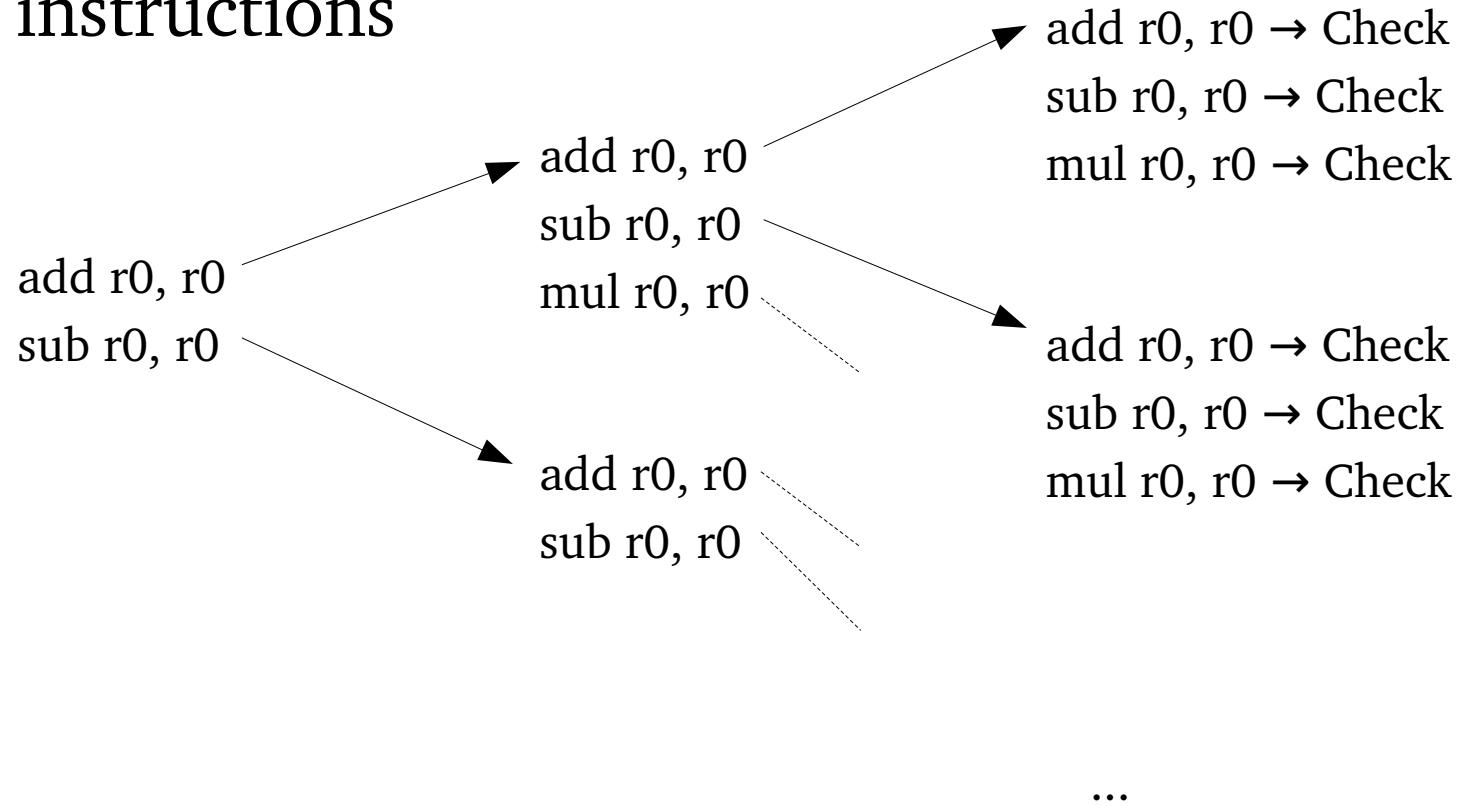
3 instructions



# How does it work?

## Iterative deepening depth first search

3 instructions

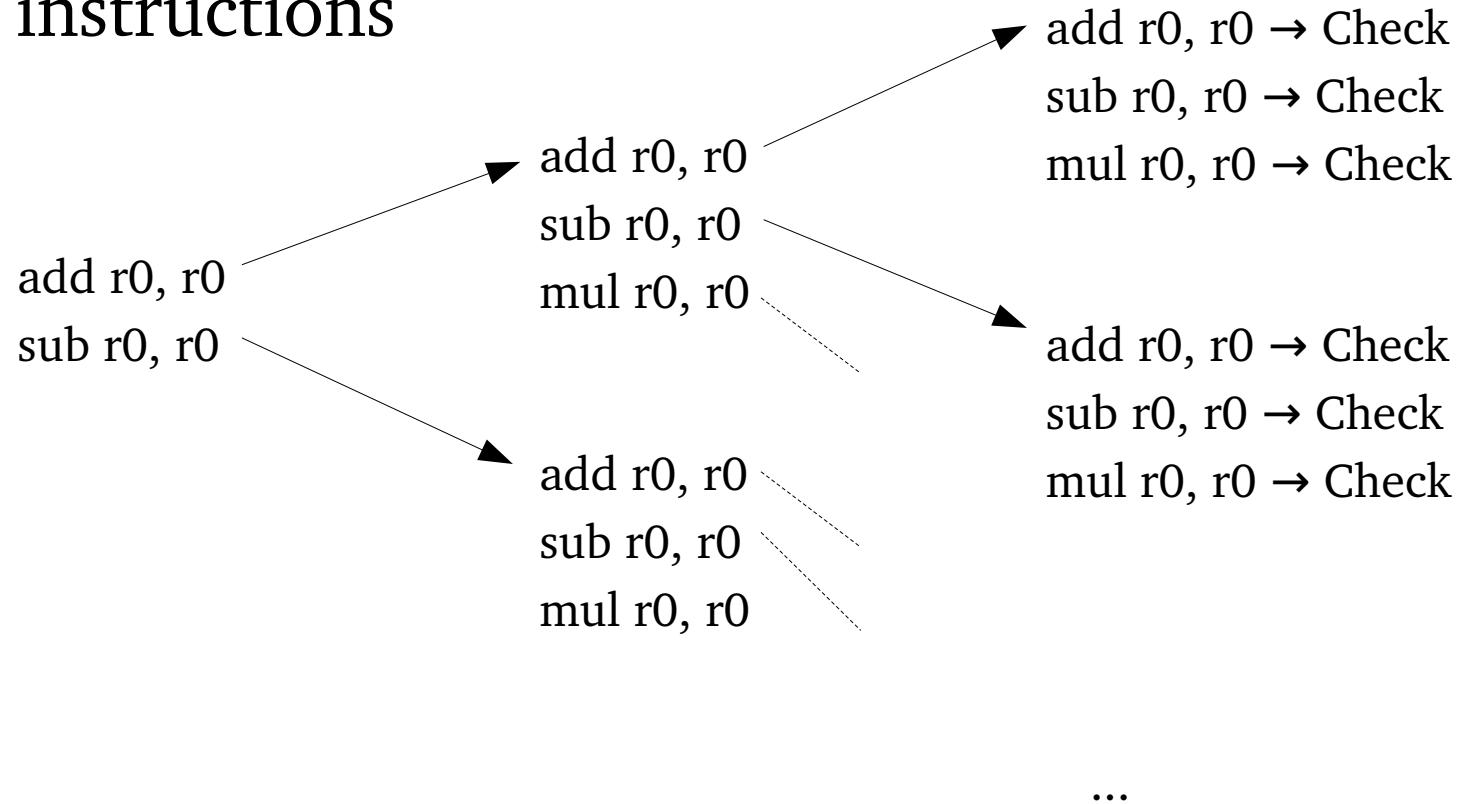


...

# How does it work?

## Iterative deepening depth first search

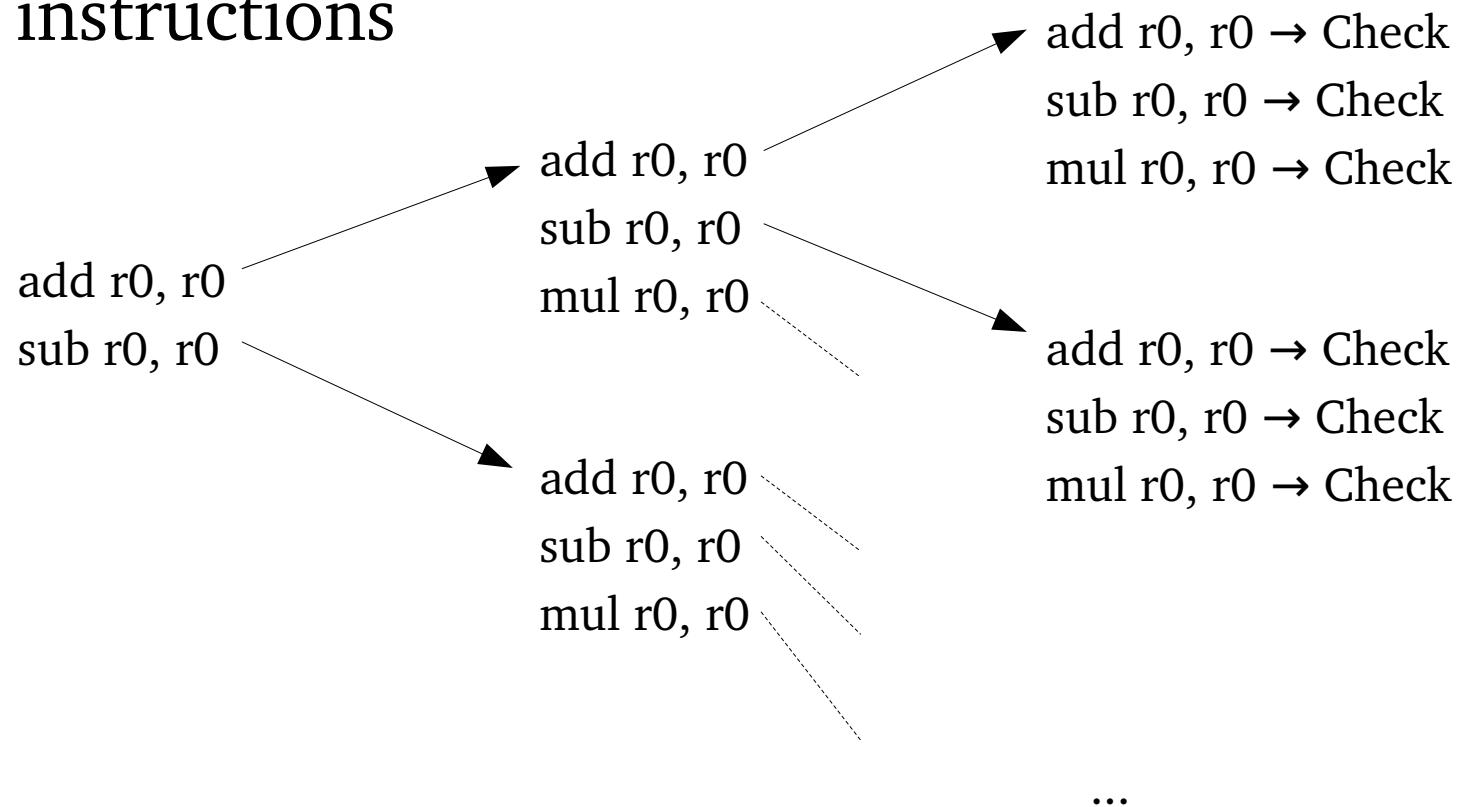
3 instructions



# How does it work?

# Iterative deepening depth first search

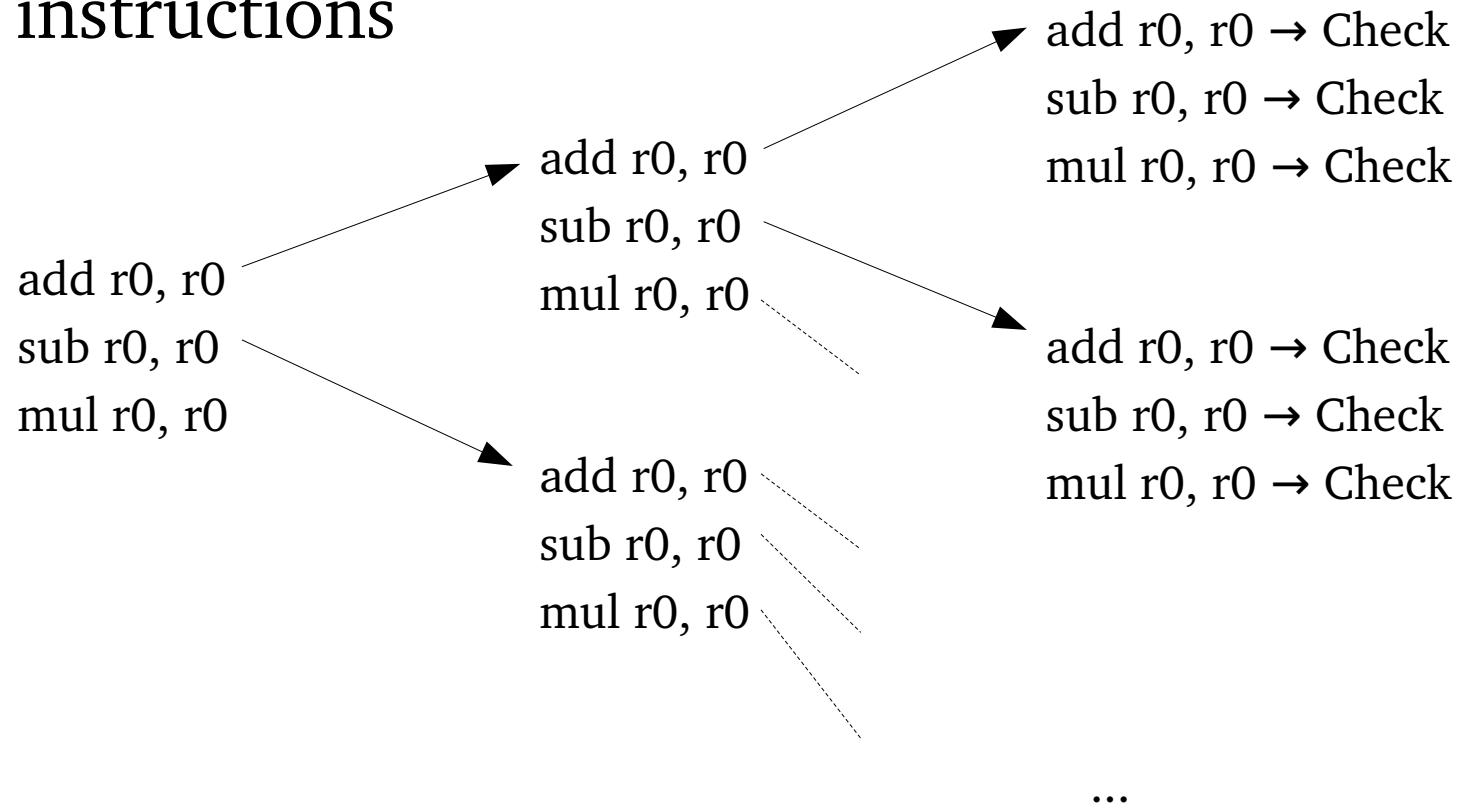
## 3 instructions



# How does it work?

## Iterative deepening depth first search

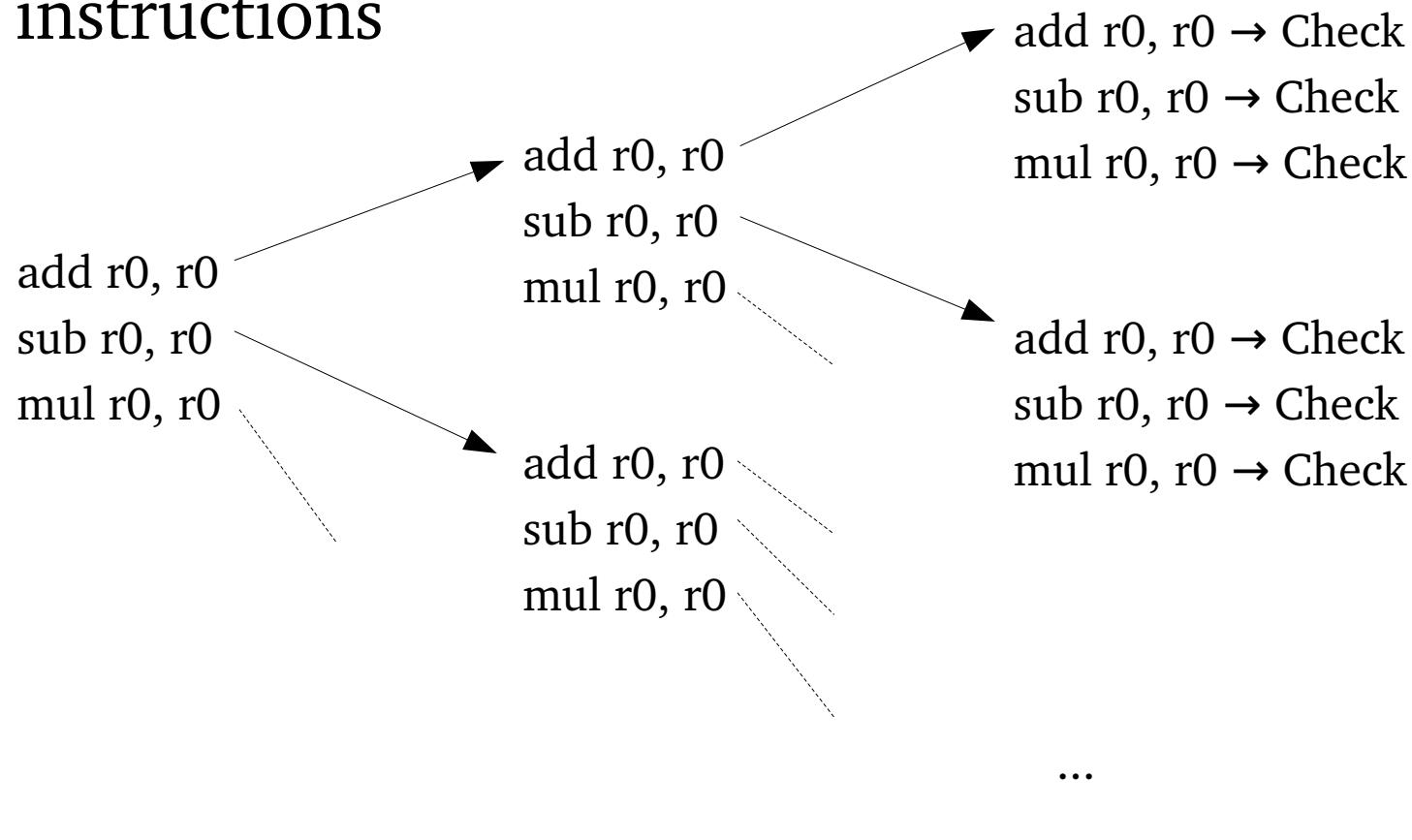
3 instructions



# How does it work?

## Iterative deepening depth first search

3 instructions



# How to add a new goal

# How to add a new goal

*Goal* is GSO's term for a target function to superoptimize

# How to add a new goal

*Goal* is GSO's term for a target function to superoptimize

File: `goal.def`

# How to add a new goal

*Goal* is GSO's term for a target function to superoptimize

File: `goal.def`

Examples:

```
DEF_GOAL (SHIFTL_1, 1, "sll1", { r = v0 << 1; })  
DEF_GOAL (SHIFTL_2, 1, "sll2", { r = v0 << 2; })
```

# How to add a new goal

*Goal* is GSO's term for a target function to superoptimize

File: `goal.def`

Examples:

```
DEF_GOAL (SHIFTL_1, 1, "sll1", { r = v0 << 1; })
DEF_GOAL (SHIFTL_2, 1, "sll2", { r = v0 << 2; })
DEF_GOAL (SIGNUM,    1, "signum",
{
    if(v0 < 0)
        r = -1;
    else if(v0 > 0)
        r = 1;
    else
        r = 0;
})
```

# How to add a new goal

# How to add a new goal

```
DEF_GOAL (EQ_MINUS, 3, "eq-", { r = v2 - (v0 == v1); })
```

# How to add a new goal

```
DEF_GOAL (EQ_MINUS, 3, "eq-", { r = v2 - (v0 == v1); })
```

Format:

```
DEF_GOAL (unique id, #args, "name", { C code; })
```

r result  
v0 argument 1  
v1 argument 2  
...



# How to add a new goal

```
DEF_GOAL (EQ_MINUS, 3, "eq-", { r = v2 - (v0 == v1); })
```

Format:

```
DEF_GOAL (unique id, #args, "name", { C code; })
```

r result  
v0 argument 1  
v1 argument 2  
...



Using the new goal:

```
$ make all
$ ./superopt-avr -fname
```

# How to add a new architecture

# How to add a new architecture

Define the implementation in `superopt.h`

- Name, types (bitwidth)

# How to add a new architecture

## Define the implementation in `superopt.h`

- Name, types (bitwidth)
- “Unusual” instructions

```
#ifndef PERFORM_AND
#define PERFORM_AND(d, co, r1, r2, ci) \
    ((d) = (r1) & (r2), (co) = (ci))
#endif
```

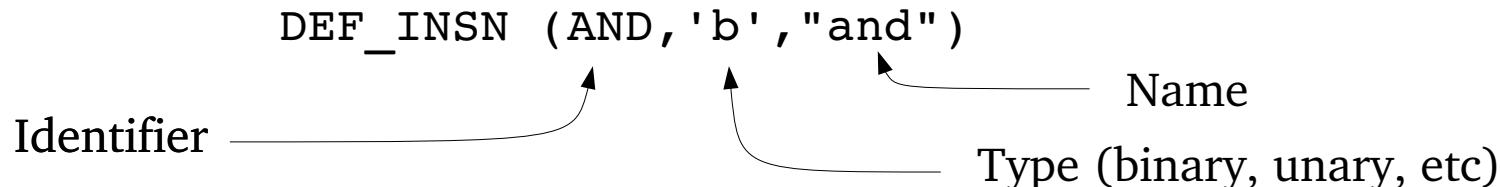
# How to add a new architecture

## Define the implementation in `superopt.h`

- Name, types (bitwidth)
- “Unusual” instructions

```
#ifndef PERFORM_AND
#define PERFORM_AND(d, co, r1, r2, ci) \
    ((d) = (r1) & (r2), (co) = (ci))
#endif
```

- Also add mnemonic into `insn.def`



# How to add a new architecture

# How to add a new architecture

To enable output in native assembler

# How to add a new architecture

To enable output in native assembler

Extend `output_assembly`

- Register names
- Disassembly code

# How to add a new architecture

To enable output in native assembler

Extend `output_assembly`

- Register names
- Disassembly code

```
case ADD_CO:  
    printf("add  
case ADD_CIO:  
    printf("adc  
                %s, %s", NAME(s1), NAME(s2)); break;  
                %s, %s", NAME(s1), NAME(s2)); break;
```

# How to add a new architecture

# How to add a new architecture

`SYNTH( . . . ) in synth.def`

# How to add a new architecture

`SYNTH( . . . )` in `synth.def`

- Where the magic happens

# How to add a new architecture

`SYNTH( . . . )` in `synth.def`

- Where the magic happens
- Loops over all the registers and all the instructions

# How to add a new architecture

## `SYNTH( . . . )` in `synth.def`

- Where the magic happens
- Loops over all the registers and all the instructions
- Use the macros for performing the instruction

# How to add a new architecture

## SYNTH( . . . ) in synth.def

- Where the magic happens
- Loops over all the registers and all the instructions
- Use the macros for performing the instruction
- Then recurses (next level of iterative deepening)

# How to add a new architecture

## `SYNTH(...)` in `synth.def`

- Where the magic happens
- Loops over all the registers and all the instructions
- Use the macros for performing the instruction
- Then recurses (next level of iterative deepening)
- Add architecture entries for standard & custom instructions

# How to add a new architecture

## SYNTH( . . . ) in synth.def

- Where the magic happens
- Loops over all the registers and all the instructions
- Use the macros for performing the instruction
- Then recurses (next level of iterative deepening)
- Add architecture entries for standard & custom instructions

```
#if SPARC || M88000
    /* sparc:           addx
       m88000:         addu.ci */
    PERFORM_ADD_CI(v, co, r1, r2, ci);
    RECURSE(ADD_CI, s1, s2, prune_hint & ~CY JUST_SET);
#endif
```

# How to add a new architecture

```
#if SPARC || M88000
    /* sparc:           addx
       m88000:         addu.ci */
    PERFORM_ADD_CI(v, co, r1, r2, ci);
    RECURSE(ADD_CI, s1, s2, prune_hint & ~CY JUST_SET);
#endif
```

# How to add a new architecture

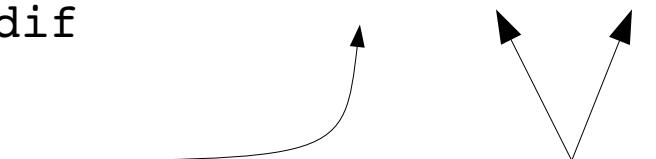
```
#if SPARC || M88000
    /* sparc:           addx
       m88000:         addu.ci */
    PERFORM_ADD_CI(v, co, r1, r2, ci);
    RECURSE(ADD_CI, s1, s2, prune_hint & ~CY JUST_SET);
#endif
```

Identifier \_\_\_\_\_  
(insn.def)



# How to add a new architecture

```
#if SPARC || M88000
    /* sparc:           addx
       m88000:         addu.ci */
    PERFORM_ADD_CI(v, co, r1, r2, ci);
    RECURSE(ADD_CI, s1, s2, prune_hint & ~CY_JUST_SET);
#endif
```

Identifier (insn.def)  Registers used

# How to add a new architecture

```
#if SPARC || M88000
    /* sparc:           addx
       m88000:         addu.ci */
    PERFORM_ADD_CI(v, co, r1, r2, ci);
    RECURSE(ADD_CI, s1, s2, prune_hint & ~CY JUST_SET);
#endif
```

Identifier  
(insn.def)

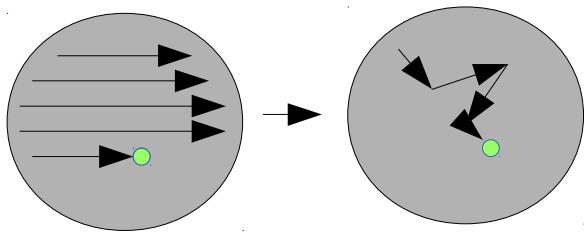
Registers  
used

Speed hints.  
(we didn't just set the carry)

The diagram illustrates the mapping of identifiers and annotations to the C code. An arrow points from 'Identifier (insn.def)' to the '#endif' directive. Two arrows point from 'Registers used' to the 'r1', 'r2', and 'ci' register identifiers in the 'RECURSE' call. A single arrow points from 'Speed hints.' to the 'prune\_hint & ~CY JUST\_SET' expression.

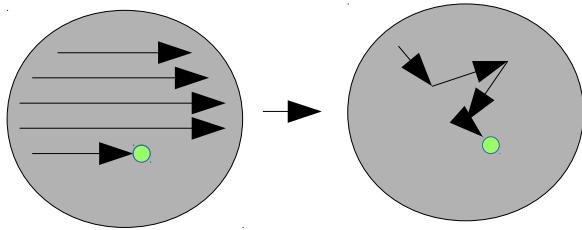
# Our plans to extend GSO

# Our plans to extend GSO

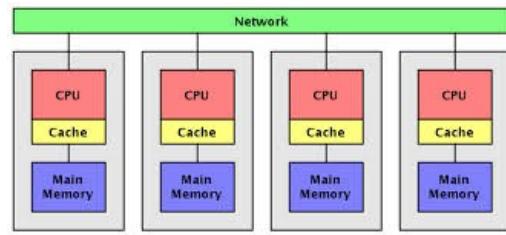


Machine learning

# Our plans to extend GSO

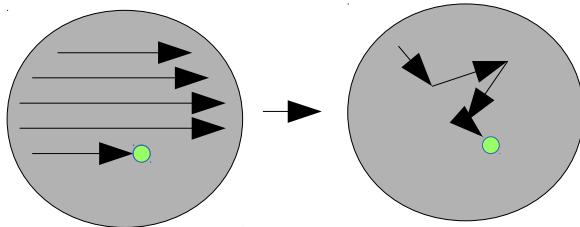


Machine learning

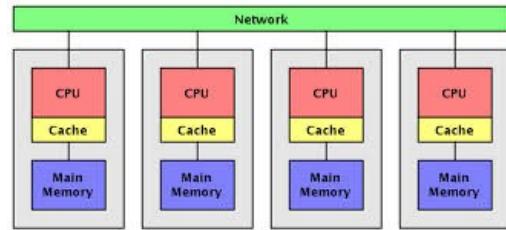


Parallelism

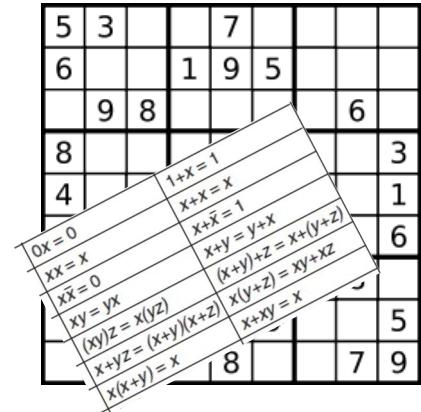
# Our plans to extend GSO



Machine learning

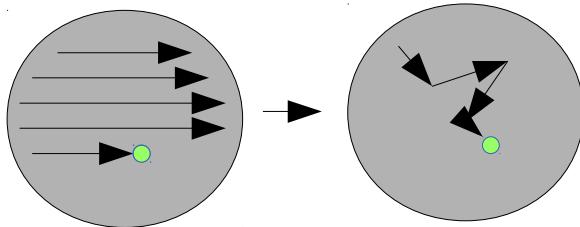


Parallelism

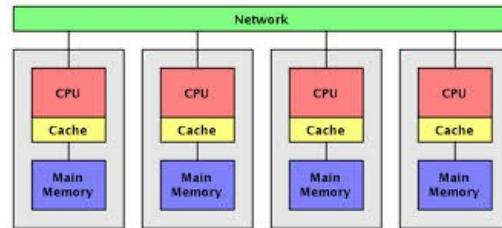


Instruction sequence  
verification

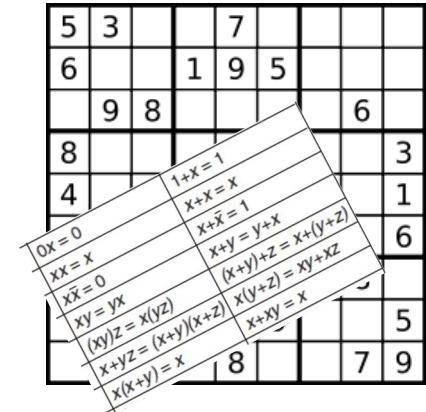
# Our plans to extend GSO



Machine learning

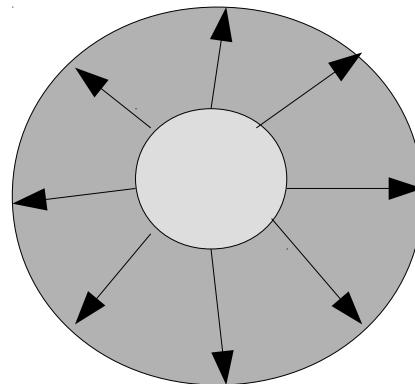


Parallelism

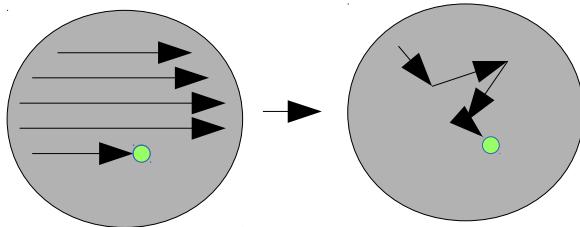


Instruction sequence  
verification

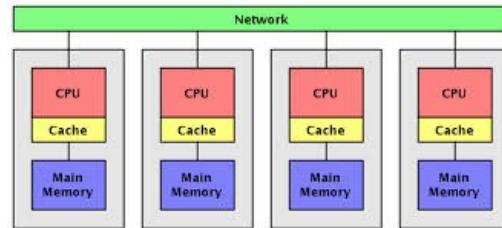
More instruction types



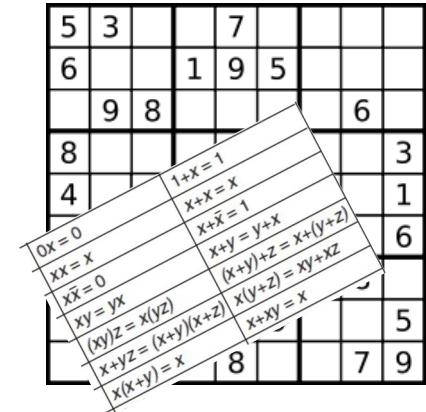
# Our plans to extend GSO



Machine learning



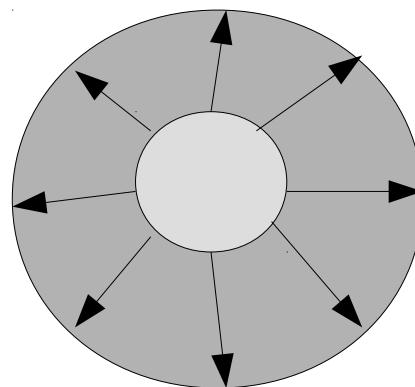
Parallelism



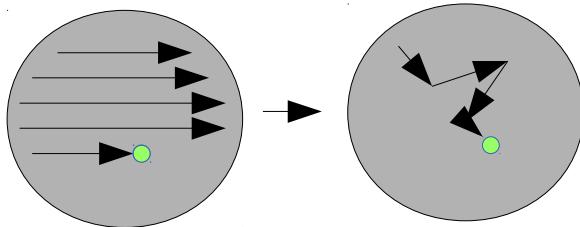
Instruction sequence  
verification

More instruction types

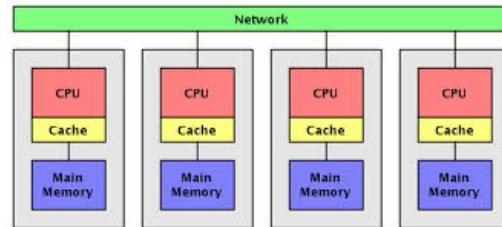
*Memory access*



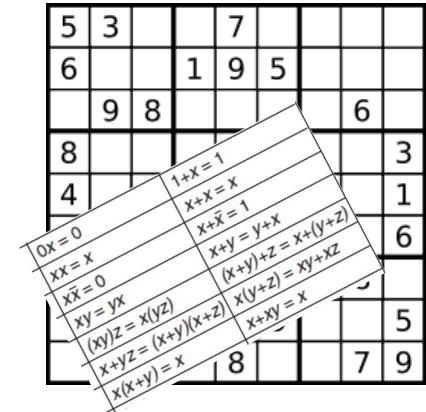
# Our plans to extend GSO



Machine learning



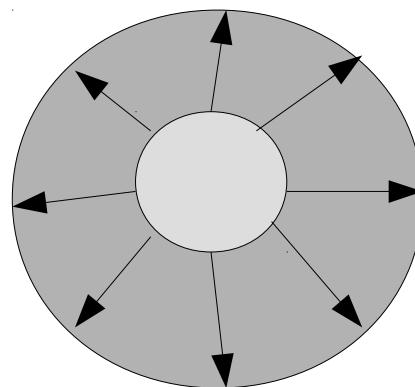
Parallelism



Instruction sequence  
verification

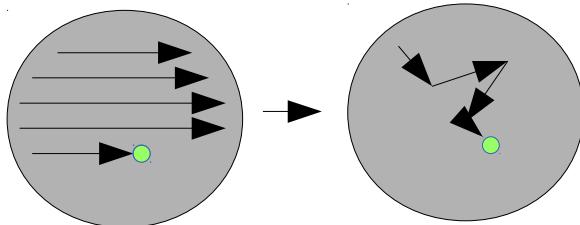
More instruction types

*Memory access*

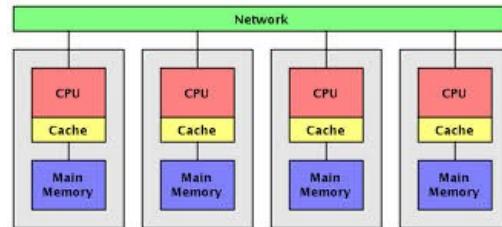


*Floating point*

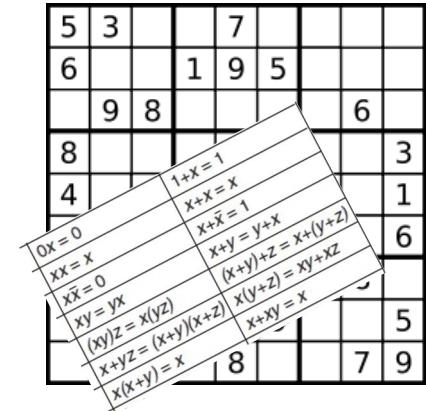
# Our plans to extend GSO



Machine learning



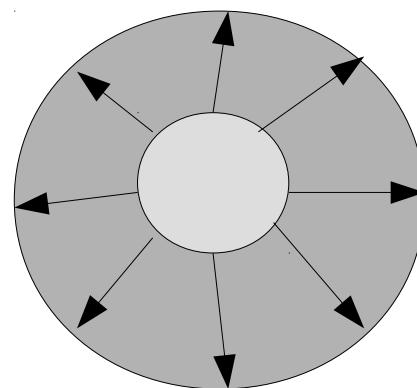
Parallelism



Instruction sequence verification

More instruction types

*Memory access*



*Floating point*

*Multiple outputs*

# Thank You

# Thank You

Superoptimization works

# Thank You

Superoptimization works

New techniques are making it better

# Thank You

Superoptimization works

New techniques are making it better

Lots of *free* software and tools

# Thank You

Superoptimization works

New techniques are making it better

Lots of *free* software and tools



# Thank You

Superoptimization works

New techniques are making it better

Lots of *free* software and tools

Try it yourself

[github.com/embecosm/gnu-superopt](https://github.com/embecosm/gnu-superopt)

