

Look-Ahead SLP: Auto-vectorization in the Presence of Commutative Operations

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Background

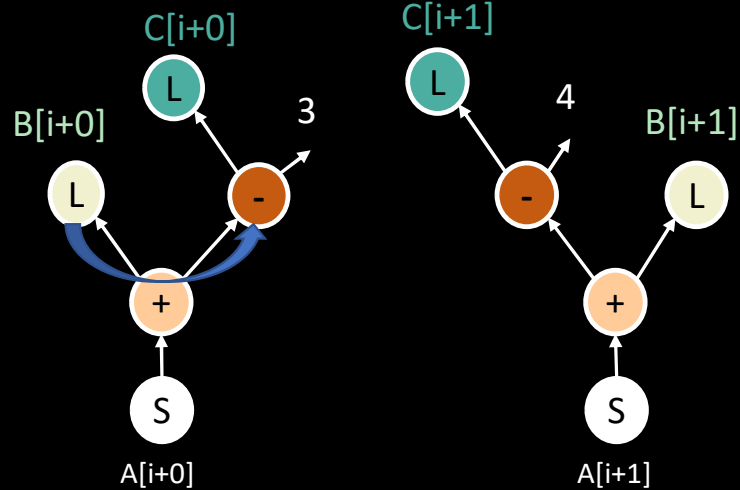
SLP: The Straight-Line Code vectorizer

- Superword Level Parallelism
- Vectorizes across instructions

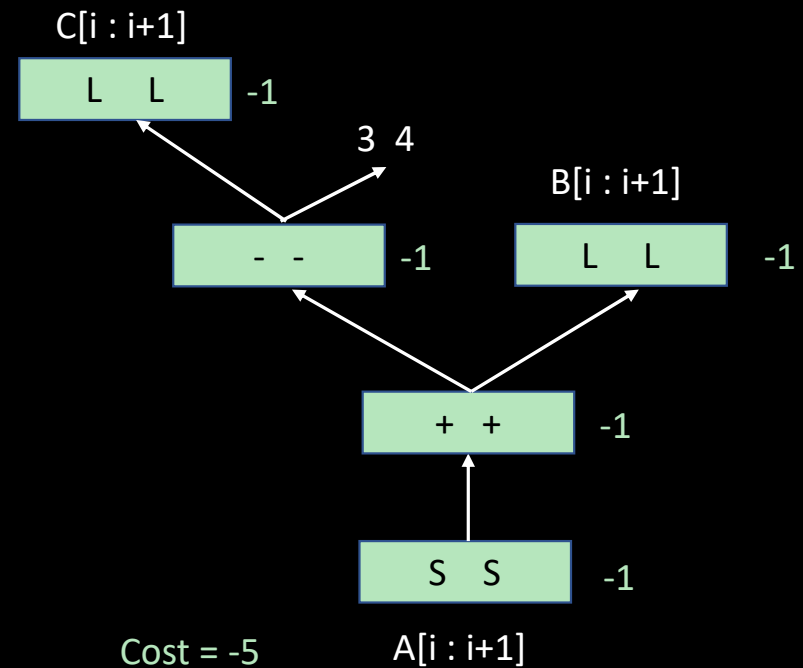
$A[i] = B[i];$
 $A[i+1] = B[i+1];$
 $A[i+2] = B[i+2];$
 $A[i+3] = B[i+3];$

→ SLP → $A[i:i+3] = B[i:i+3];$

How SLP works



```
long A[], B[], C[];
A[i+0] = B[i+0]      + (C[i+0] - 3);
A[i+1] = (C[i+1] - 4) + B[i+1];
```



Motivation

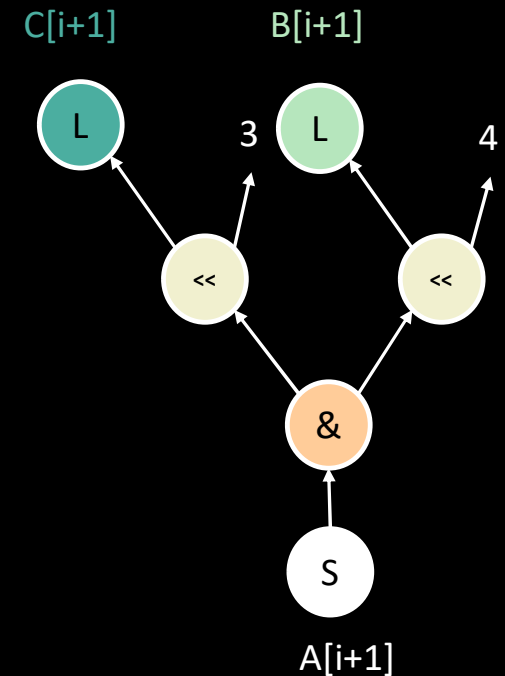
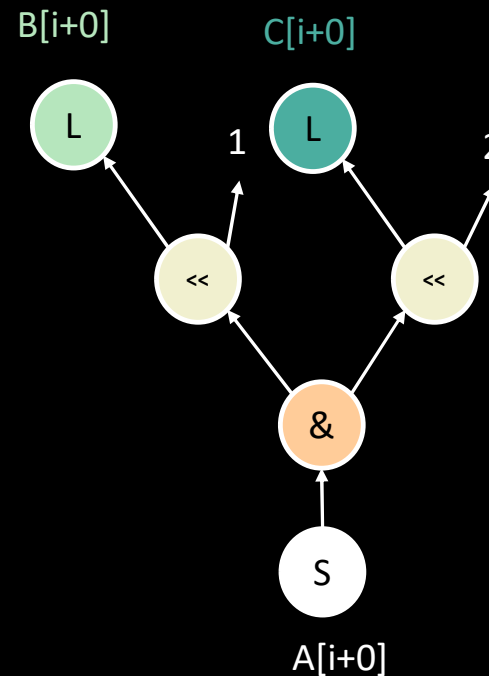
- Load Address Mismatch
- Opcode Mismatch
- Associativity Mismatch and Multi-Node

SLP Failure: Load Address Mismatch

```
1 long A[], B[], C[];  
2 A[i+0] = (B[i+0] << 1) & (C[i+0] << 2);  
3 A[i+1] = (C[i+1] << 3) & (B[i+1] << 4);
```

SLP Failure: Load Address Mismatch

Use-def Chains DAG



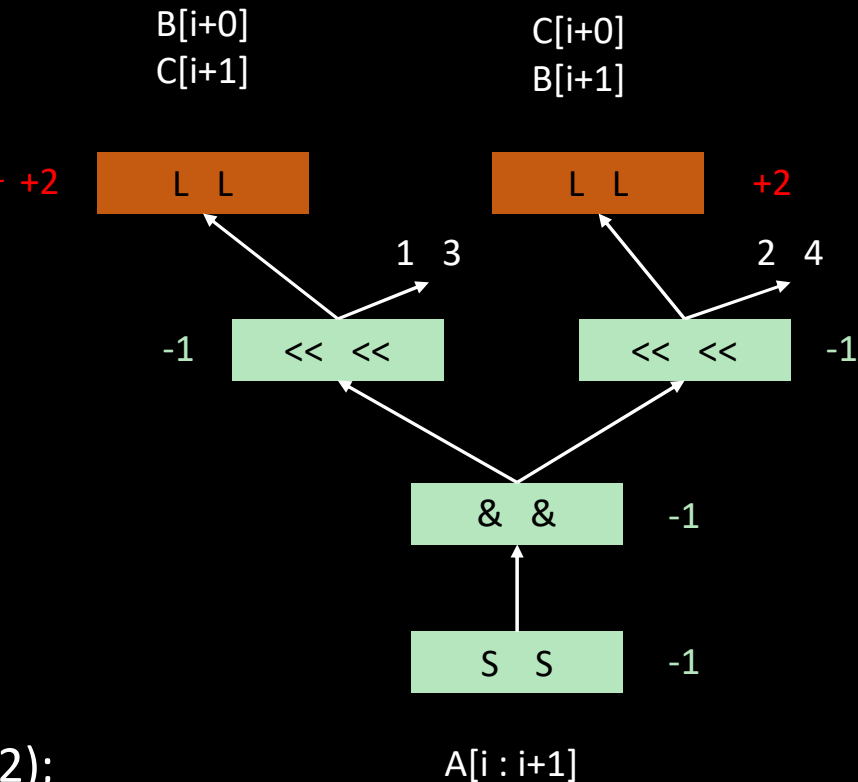
- 1 `long A[], B[], C[];`
- 2 `A[i+0] = (B[i+0] << 1) & (C[i+0] << 2);`
- 3 `A[i+1] = (C[i+1] << 3) & (B[i+1] << 4);`

SLP Failure: Load Address Mismatch

Extra cost for
gathering and
aggregating

Total cost: 0

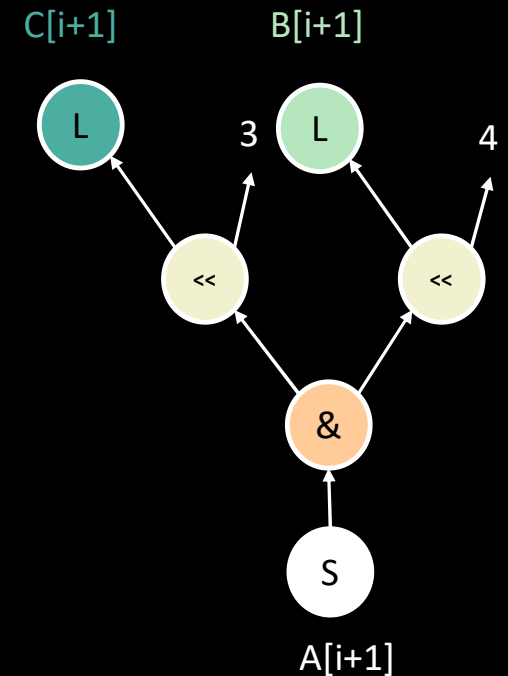
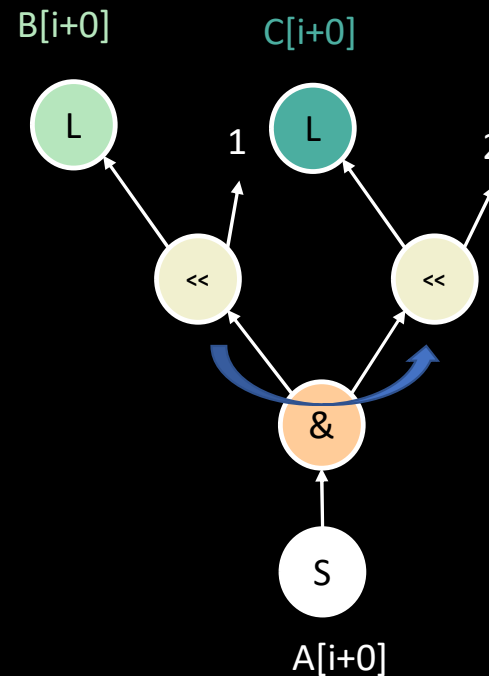
```
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2 A[i+0] = (B[i+0] << 1) & (C[i+0] << 2);  
3 A[i+1] = (C[i+1] << 3) & (B[i+1] << 4);
```



SLP

SLP Failure: Load Address Mismatch

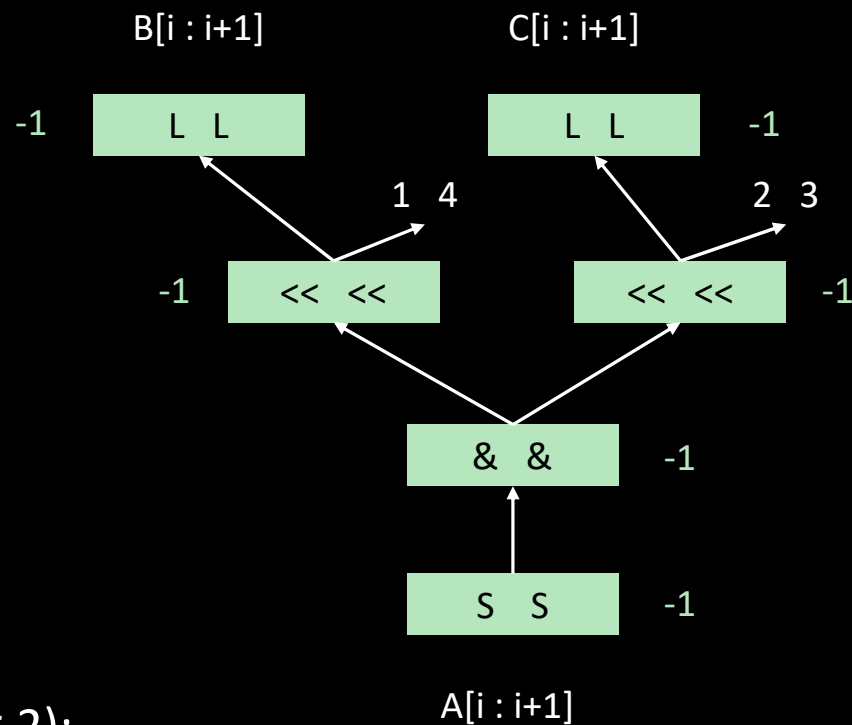
Use-def Chains DAG



- 1 `long A[], B[], C[];`
- 2 `A[i+0] = (B[i+0] << 1) & (C[i+0] << 2);`
- 3 `A[i+1] = (C[i+1] << 3) & (B[i+1] << 4);`

SLP Failure: Load Address Mismatch

Total cost: -6



LSLP

- 1 `long A[], B[], C[];`
- 2 `A[i+0] = (B[i+0] << 1) & (C[i+0] << 2);`
- 3 `A[i+1] = (C[i+1] << 3) & (B[i+1] << 4);`

SLP Failure: Opcode Mismatch

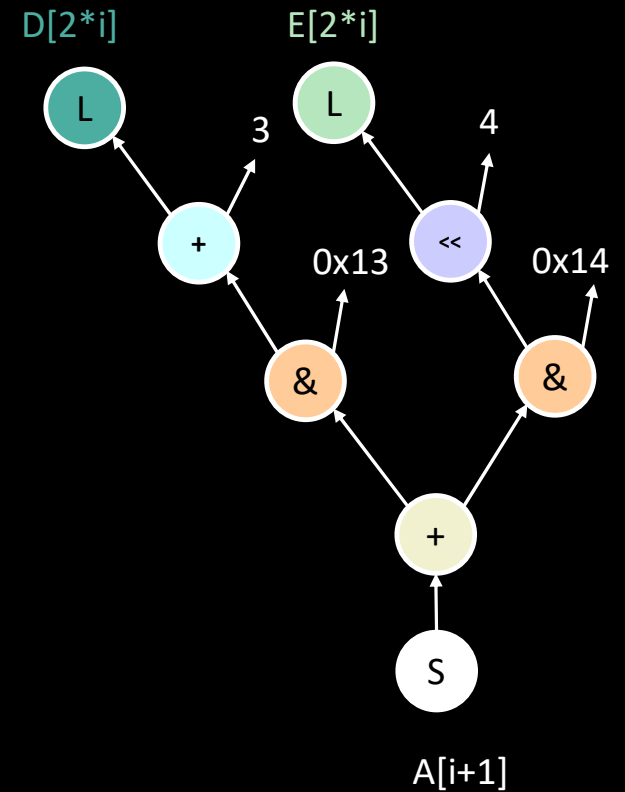
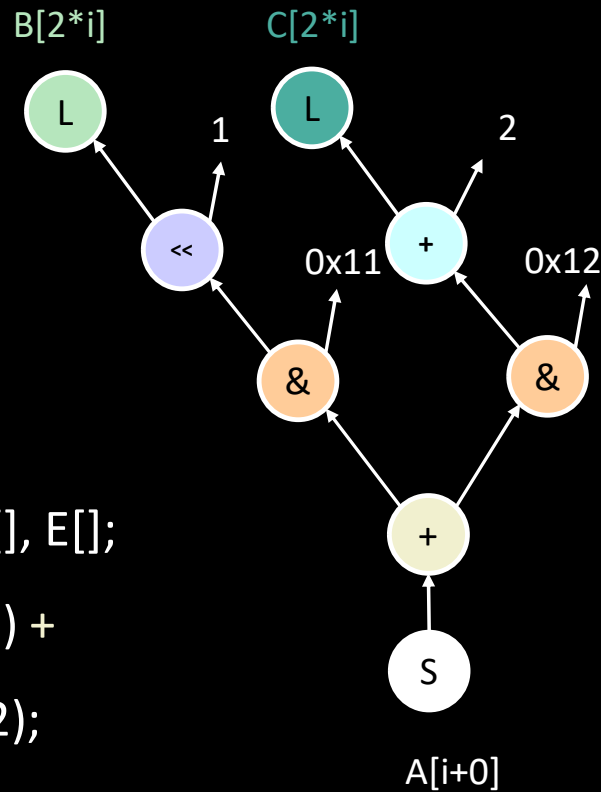
```
1 unsigned long A[], B[], C[], D[], E[];
```

```
2 A[i+0] = ((B[2*i] << 1) & 0x11) +  
           ((C[2*i] + 2) & 0x12);
```

```
3 A[i+1] = ((D[2*i] + 3) & 0x13) +  
           ((E[2*i] << 4) & 0x14);
```

SLP Failure: Opcode Mismatch

Use-def Chains DAG

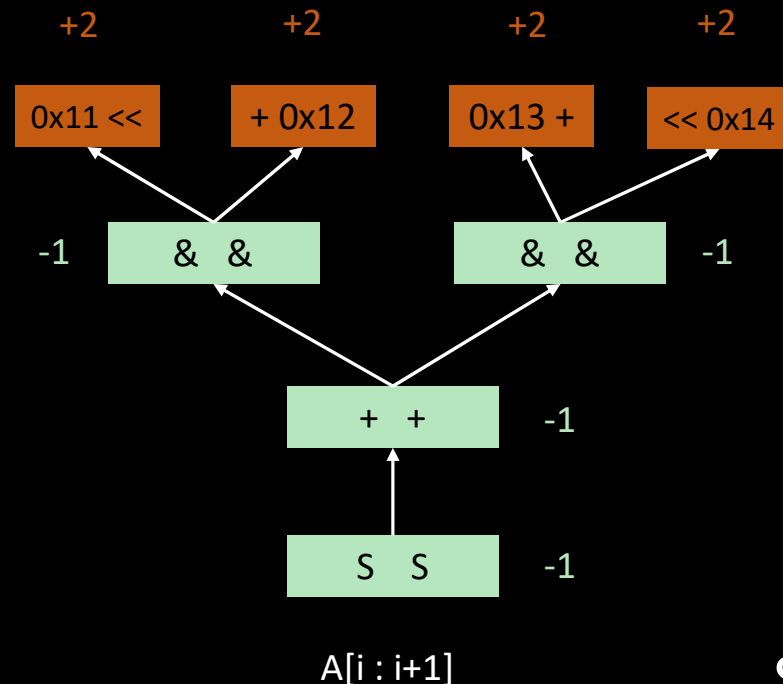


- 1 unsigned long A[], B[], C[], D[], E[];
- 2 $A[i+0] = ((B[2*i] \ll 1) \& 0x11) + ((C[2*i] + 2) \& 0x12);$
- 3 $A[i+1] = ((D[2*i] + 3) \& 0x13) + ((E[2*i] \ll 4) \& 0x14);$

SLP Failure: Opcode Mismatch

Total cost: +4

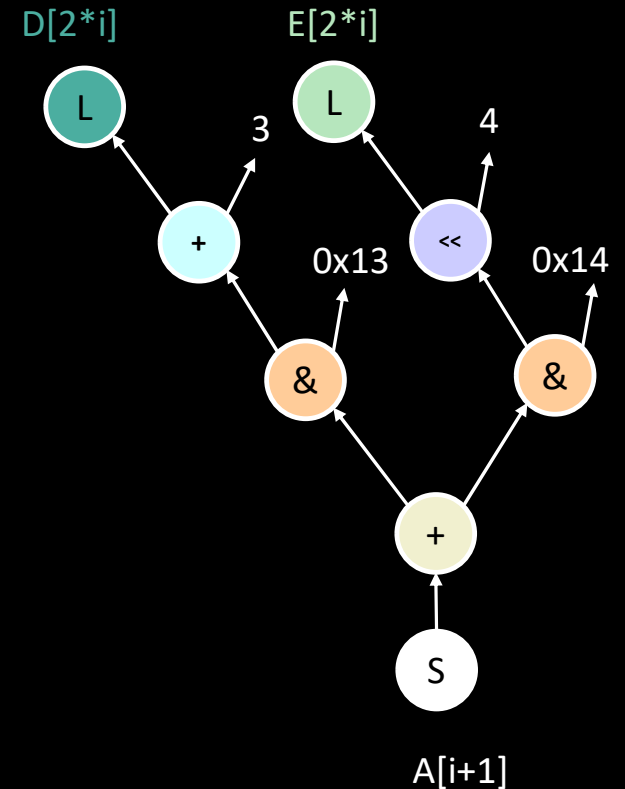
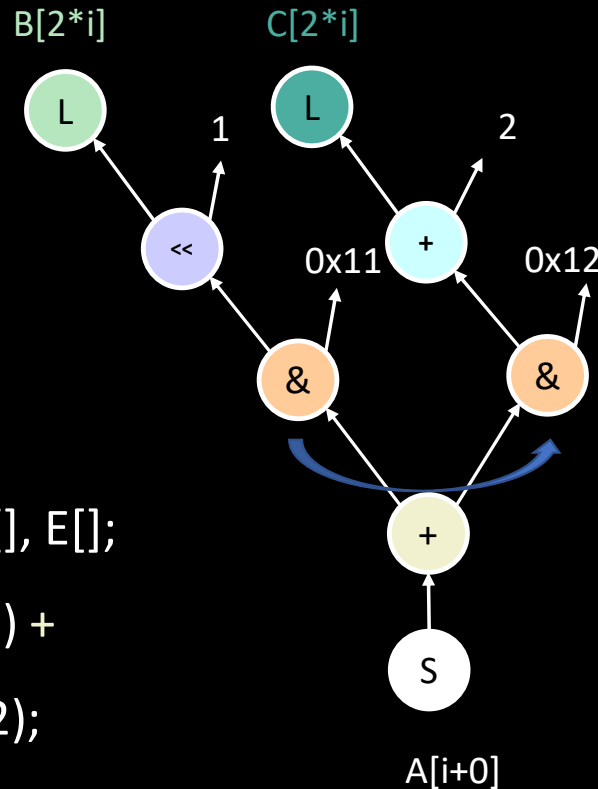
```
1 unsigned long A[], B[], C[], D[], E[];  
2 A[i+0] = ((B[2*i] << 1) & 0x11) +  
           ((C[2*i] + 2) & 0x12);  
3 A[i+1] = ((D[2*i] + 3) & 0x13) +  
           ((E[2*i] << 4) & 0x14);
```



SLP

SLP Failure: Opcode Mismatch

Use-def Chains DAG



- 1 unsigned long A[], B[], C[], D[], E[];
- 2 $A[i+0] = ((B[2*i] \ll 1) \& 0x11) + ((C[2*i] + 2) \& 0x12);$
- 3 $A[i+1] = ((D[2*i] + 3) \& 0x13) + ((E[2*i] \ll 4) \& 0x14);$

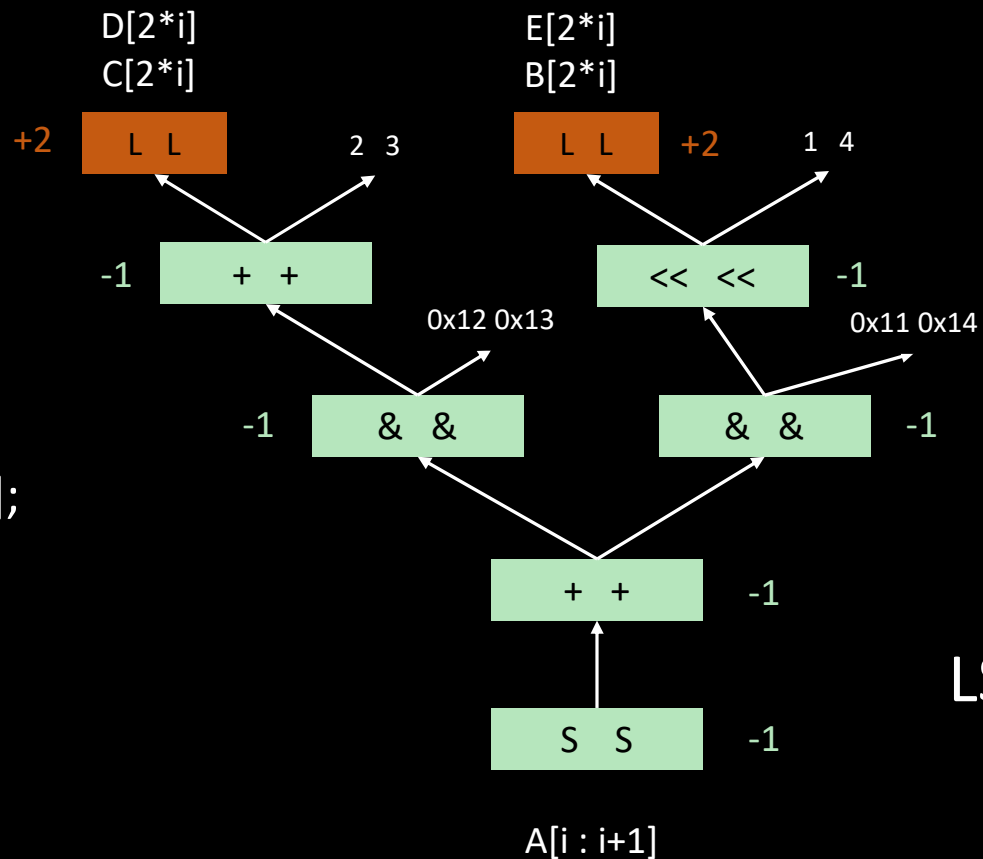
SLP Failure: Opcode Mismatch

Total cost: -2

```

1 unsigned long A[], B[], C[], D[], E[];
2 A[i+0] = ((B[2*i] << 1) & 0x11) +
           ((C[2*i] + 2) & 0x12);
3 A[i+1] = ((D[2*i] + 3) & 0x13) +
           ((E[2*i] << 4) & 0x14);

```



LSLP

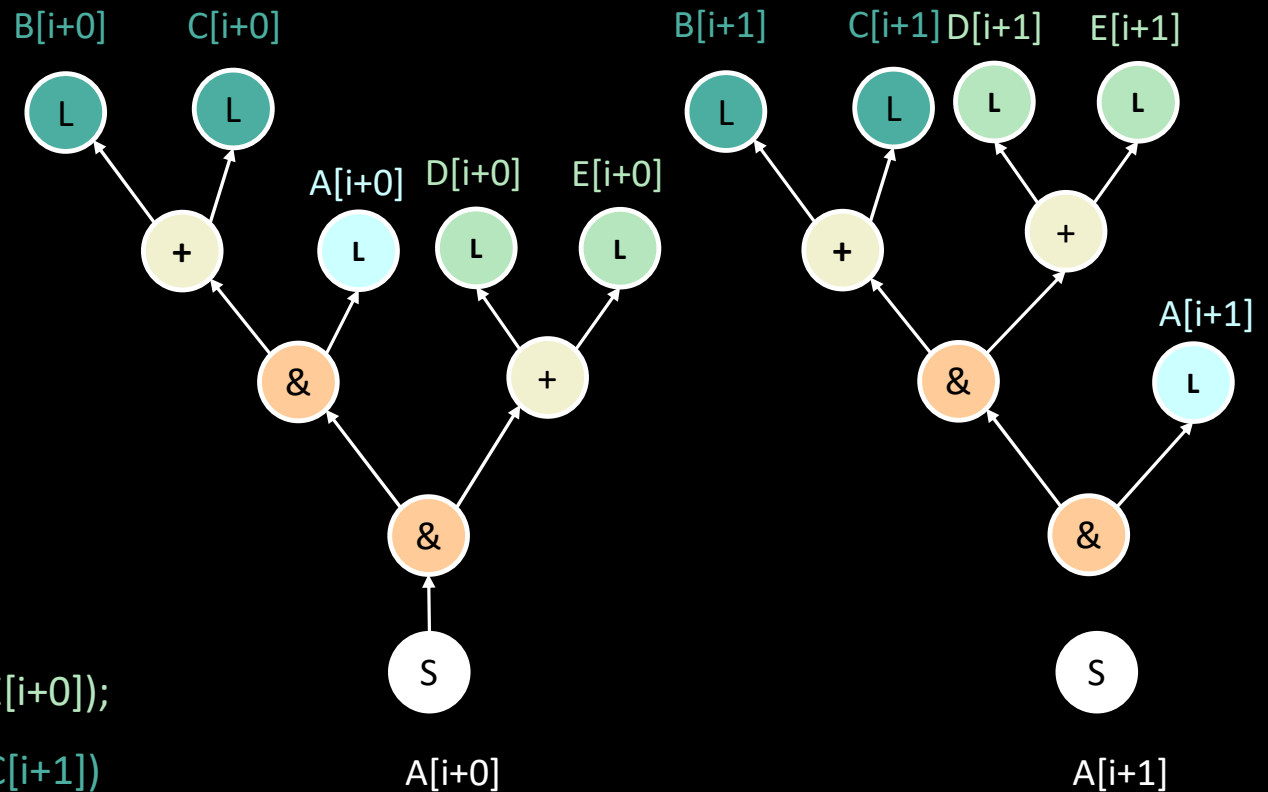
SLP Failure: Associativity Mismatch and Multi-Node

```
1 unsigned long A[], B[], C[], D[], E[];  
2 A[i+0] = A[i+0] &  
    (B[i+0] + C[i+0]) & (D[i+0] + E[i+0]);  
3 A[i+1] = (D[i+1] + E[i+1]) & (B[i+1] + C[i+1])  
    & A[i+1];
```

SLP Failure: Associativity Mismatch and Multi-Node

Use-def Chains DAG

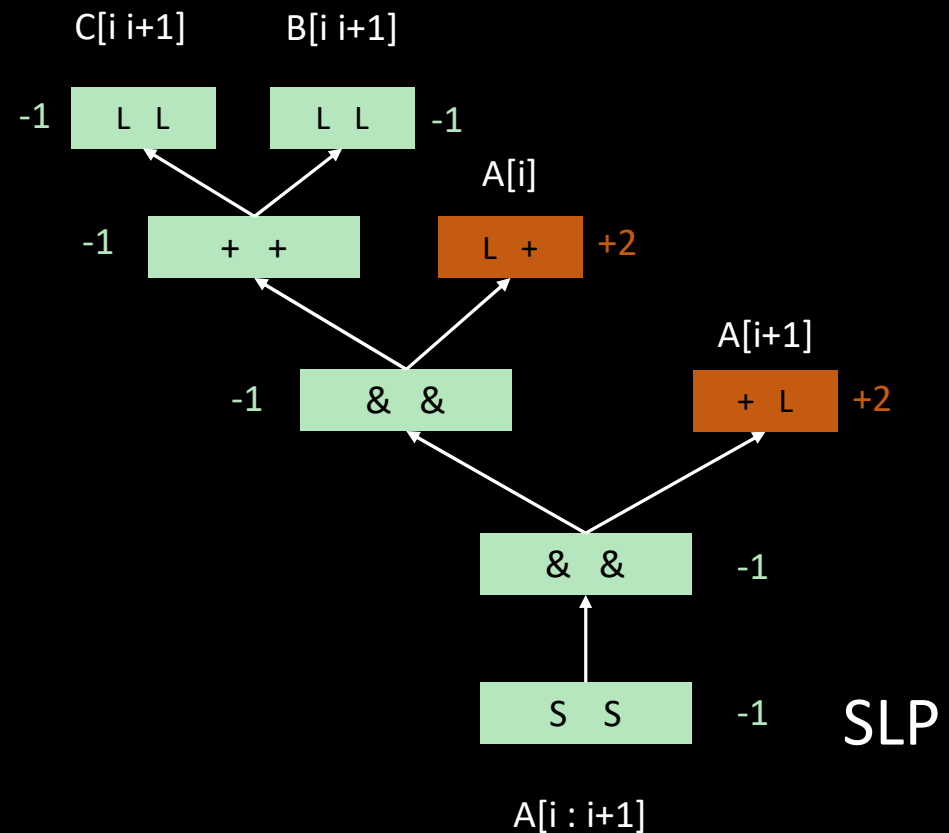
- 1 unsigned long A[], B[], C[], D[], E[];
- 2 $A[i+0] = A[i+0] \& (B[i+0] + C[i+0]) \& (D[i+0] + E[i+0]);$
- 3 $A[i+1] = (D[i+1] + E[i+1]) \& (B[i+1] + C[i+1]) \& A[i+1];$



SLP Failure: Associativity Mismatch and Multi-Node

Total cost: -2

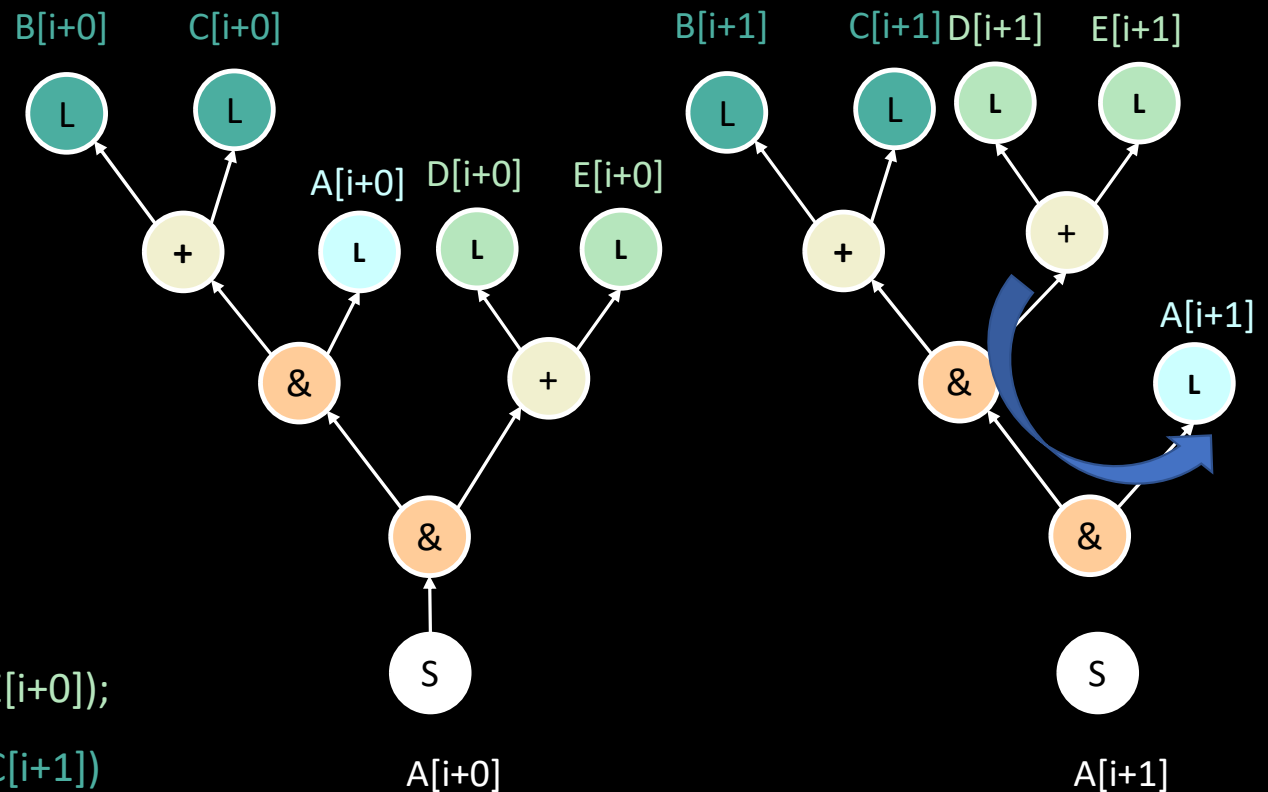
- 1 unsigned long A[], B[], C[], D[], E[];
- 2 $A[i+0] = A[i+0] \& (B[i+0] + C[i+0]) \& (D[i+0] + E[i+0]);$
- 3 $A[i+1] = (D[i+1] + E[i+1]) \& (B[i+1] + C[i+1]) \& A[i+1];$



SLP Failure: Associativity Mismatch and Multi-Node

Use-def Chains DAG

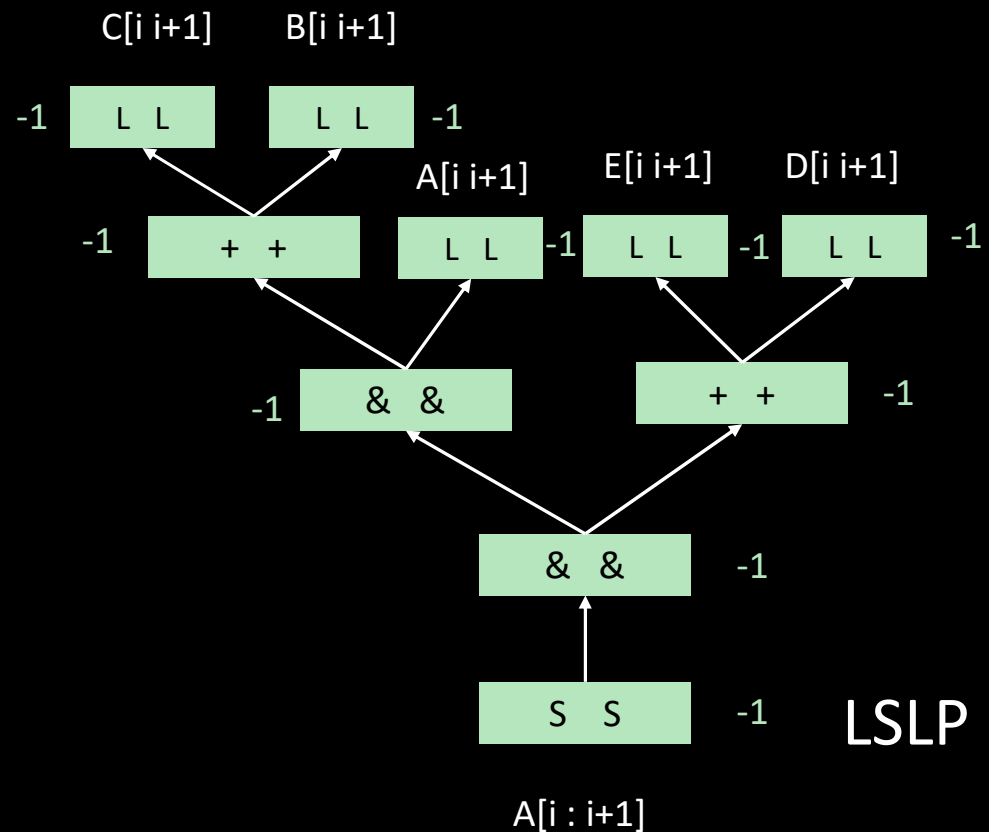
- 1 unsigned long A[], B[], C[], D[], E[];
- 2 $A[i+0] = A[i+0] \& (B[i+0] + C[i+0]) \& (D[i+0] + E[i+0]);$
- 3 $A[i+1] = (D[i+1] + E[i+1]) \& (B[i+1] + C[i+1]) \& A[i+1];$



SLP Failure: Associativity Mismatch and Multi-Node

Total cost: -10

- 1 unsigned long A[], B[], C[], D[], E[];
- 2 $A[i+0] = A[i+0] \& (B[i+0] + C[i+0]) \& (D[i+0] + E[i+0]);$
- 3 $A[i+1] = (D[i+1] + E[i+1]) \& (B[i+1] + C[i+1]) \& A[i+1];$



LSLP

Motivation

- Load Address Mismatch
SLP: 0 LSLP: -6
- Opcode Mismatch
SLP: +4 LSLP: -2
- Associativity Mismatch and Multi-Node
SLP: -2 LSLP: -10

Look-Ahead SLP – Overview

1. Multi-Node Formation

- Multi-Node: Chained multiple commutative operations;
- e.g.: $A[i+0] \& (B[i+0] + C[i+0]) \& (D[i+0] + E[i+0])$

2. Top-Level Operand Reordering

- Use Look-Ahead score for non-trivial case;

3. Run (1) recursively on reordered operands.

Multi-Node Formation

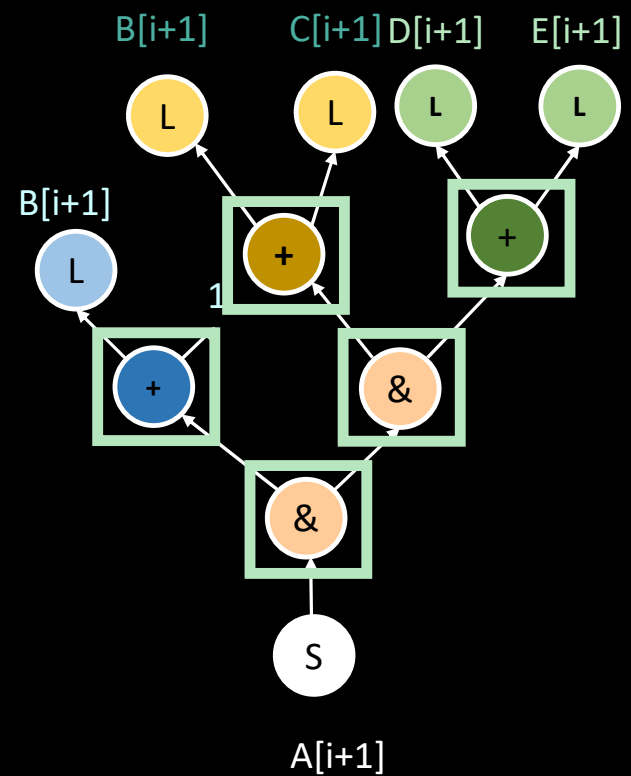
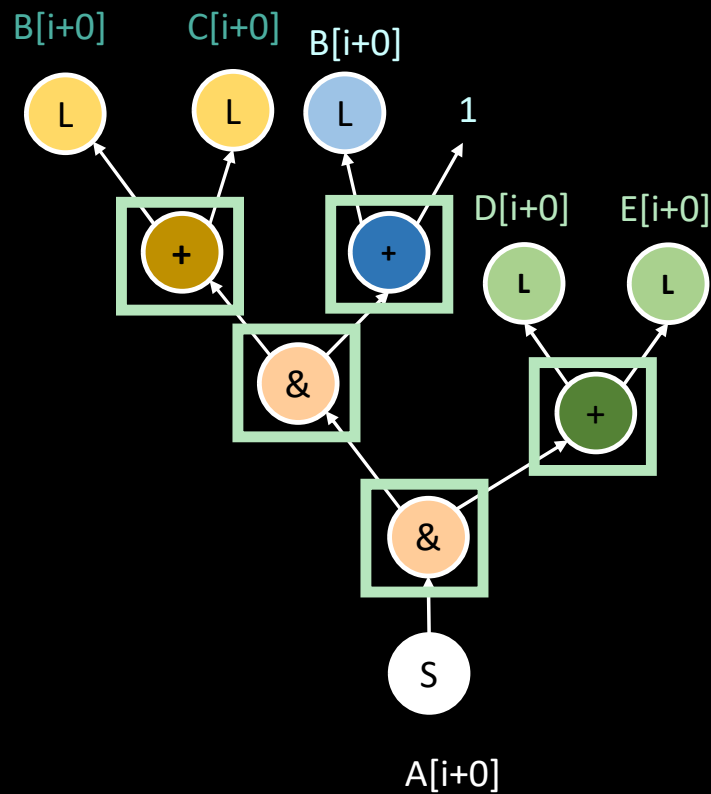
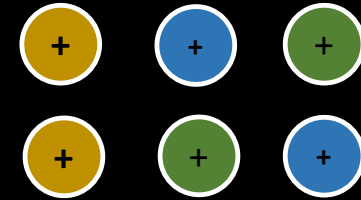
```
build_graph(values):  
  if values are non-vectorizable: return  
  if values are commutative:  
    foreach operands of values:  
      if opcode matches  
        and not escape multi-node:  
          build_graph(operands)  
      else:  
        add operands to multimode-operands  
  if values are root of multi-node:  
    // reorder and build_graph recursively  
else:  
  // build_graph recursively
```

Core Idea:

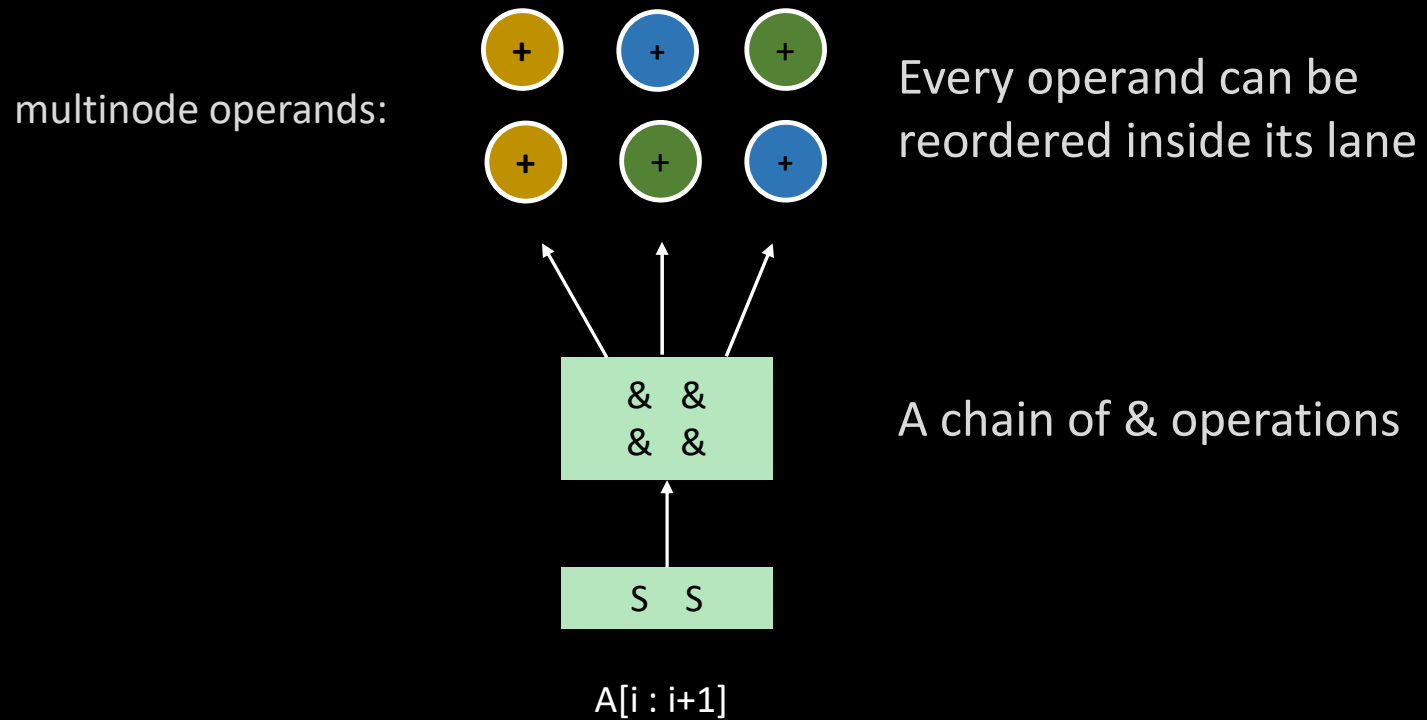
1. Given a commutative operation at the root;
2. Find connected component with same opcode in the children;
3. Group the operands of the members of connected component together.

Multi-Node Formation

multinode operands:

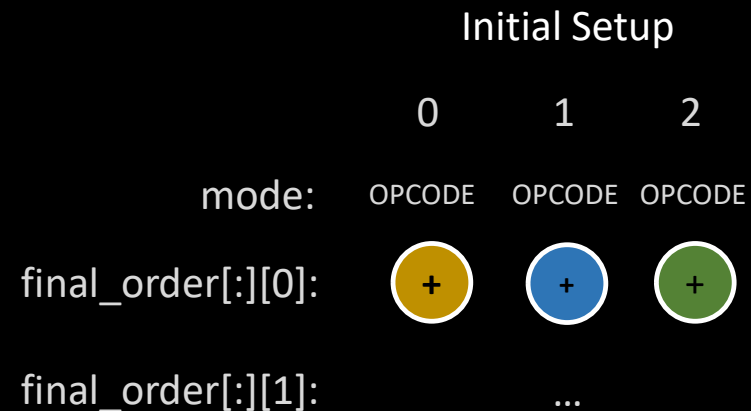
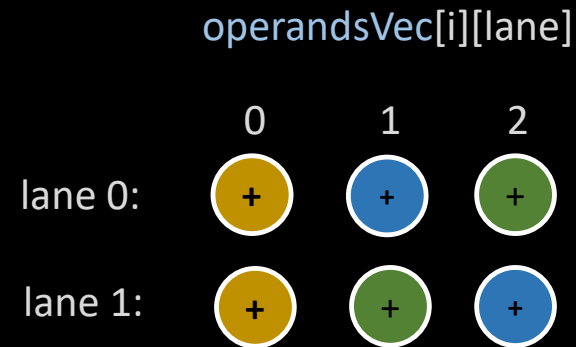


Multi-Node Formation - Result



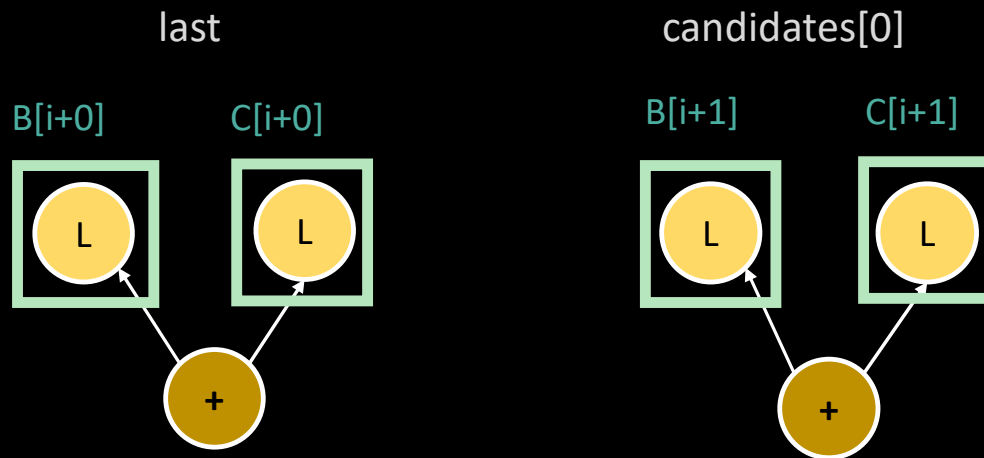
Top-Level Operand Reordering

```
reorder_operands(operandsVec):  
    setup mode and final_order for operands  
    based on first lane  
    foreach lane:  
        foreach i in {0..numOperands}  
            if mode[i] is FAILED: continue  
            last = final_order[i][lane - 1]  
            get_best(mode[i], last,  
operandsVec[:, lane])  
            update final_order  
    return final_order
```



Top-Level Operand Reordering – get_best

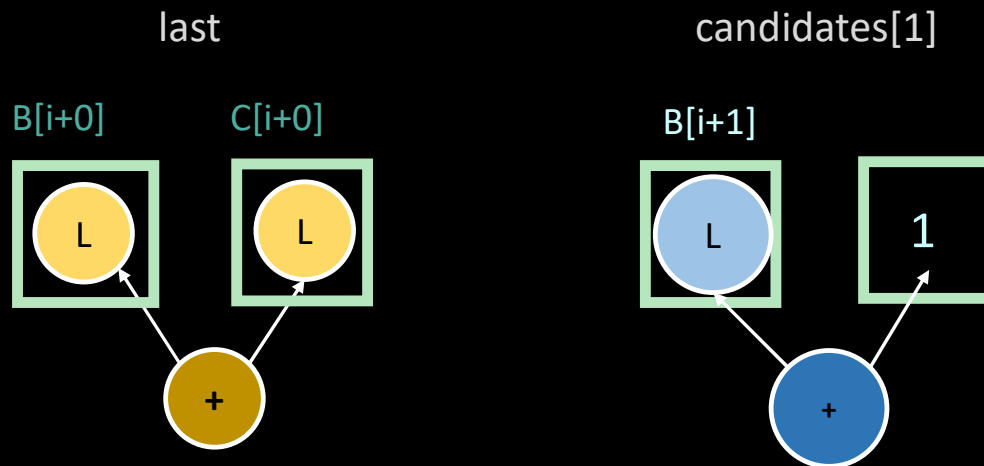
mode last candidates
`get_best(OPCODE,` `, [` `,` `,` `] )`



LAScore: $1+0+0+1 = 2$

Top-Level Operand Reordering – get_best

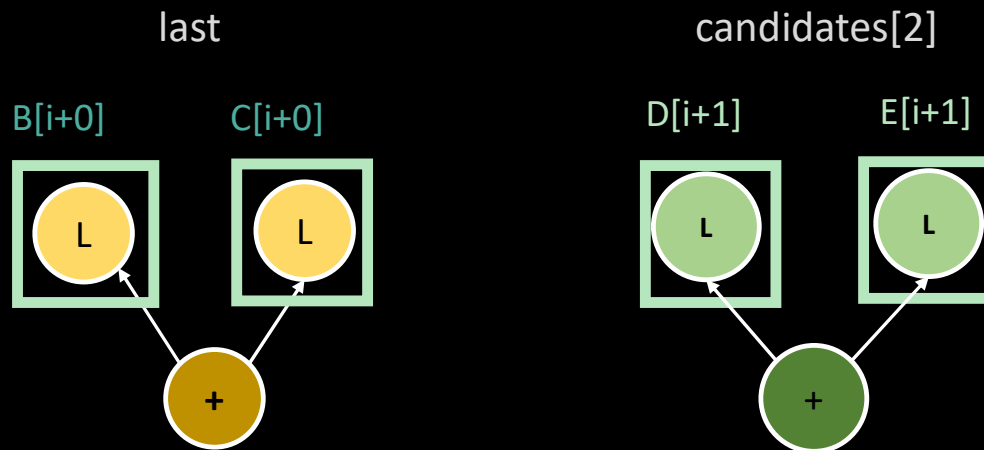
mode last candidates
`get_best(OPCODE,` `, [` `,` `,` `] )`



LAScore: $1+0+0+0 = 1$

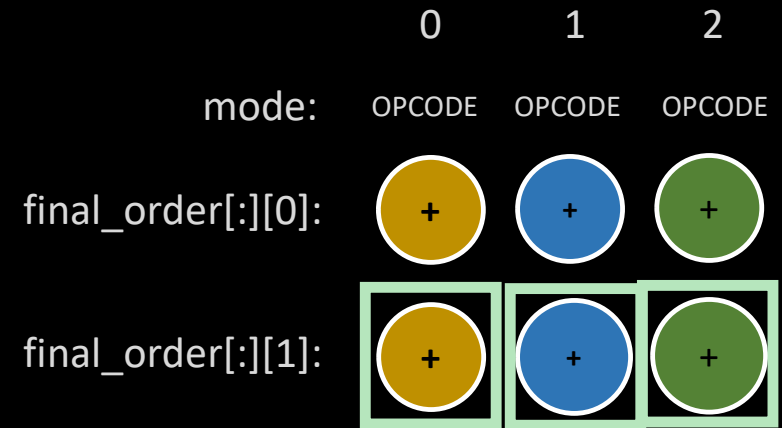
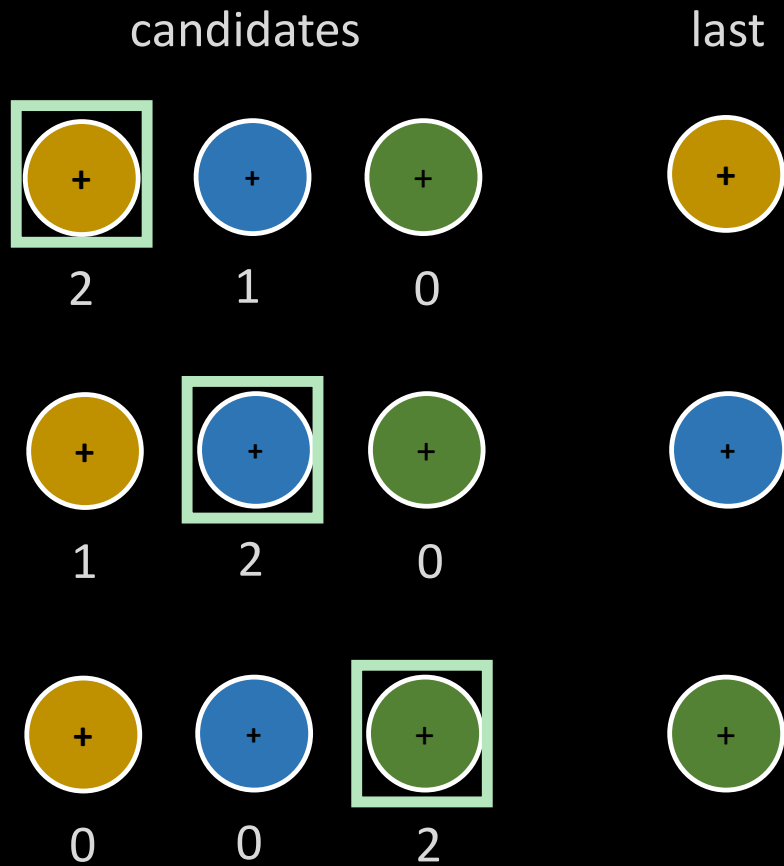
Top-Level Operand Reordering – get_best

mode last candidates
`get_best(OPCODE,` `, [` `,` `,` `] )`



LAScore: $0+0+0+0 = 0$

Top-Level Operand Reordering – Result



Experimental Setup

Evaluated the following cases:

- **Baseline:** All Loop, SLP and LSLP vectorizers disabled (O3)
- O3 + SLP enabled but No Operand Reordering(SLP-NR)
- O3 + SLP enabled (SLP)
- O3 + LSLP enabled (LSLP)

Evaluation – Speedup

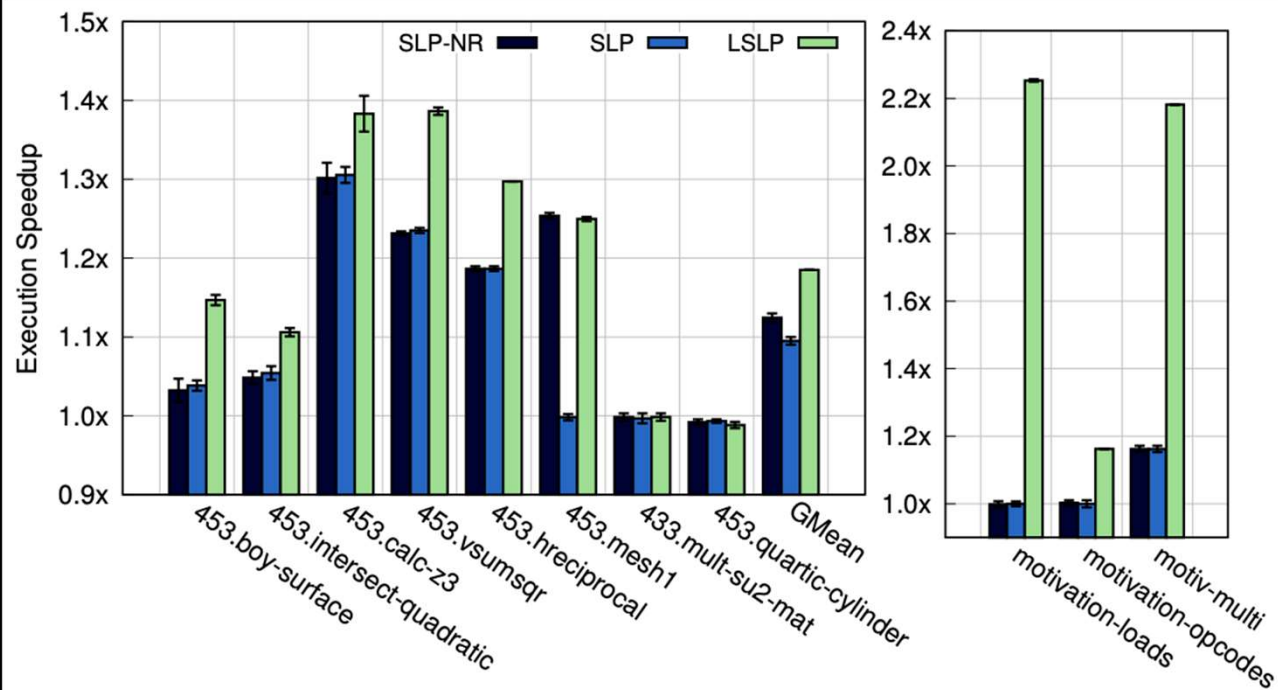


Figure 9. Speedup of LSLP, SLP and SLP-NR over O3.

Evaluation – Total Static Cost Seen by Each Scheme

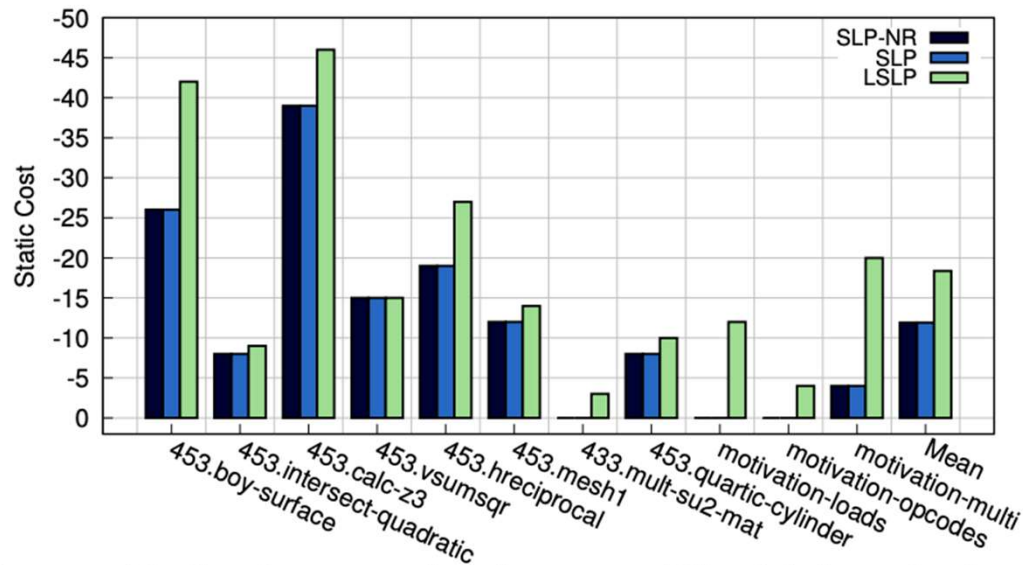


Figure 10. Static vectorization cost. The higher the better.

LSLP can locally improve individual vectorization regions compared to both SLP and SLP-NR

Evaluation – Compilation Time

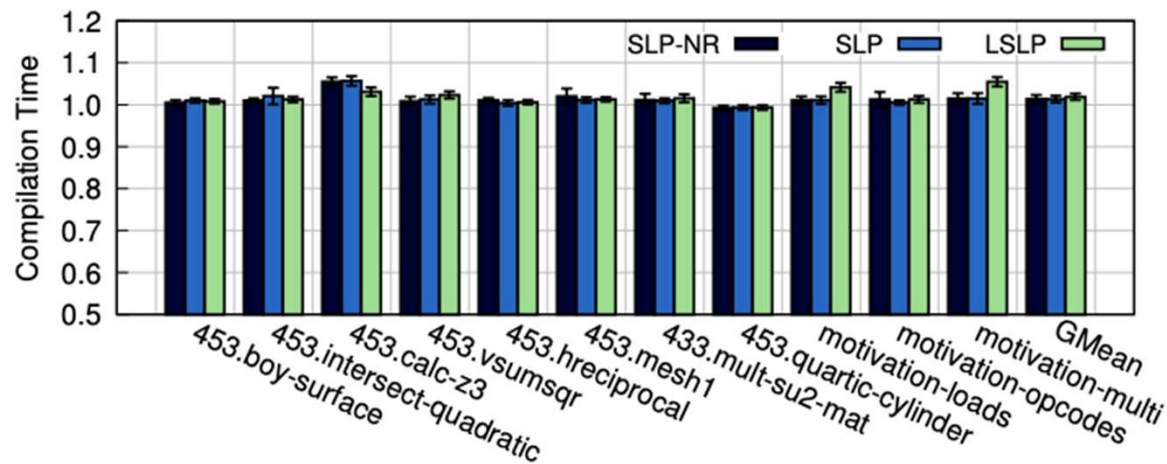


Figure 14. Compilation time, normalized to O3 (LA=8).

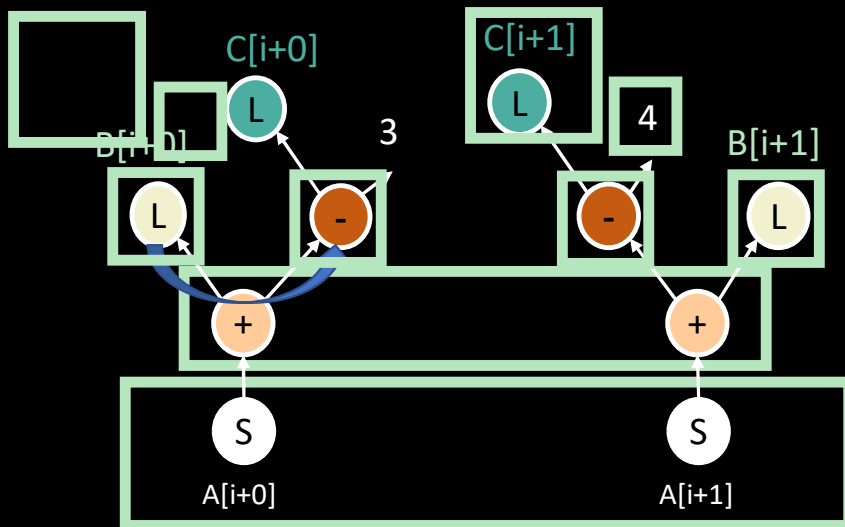
On average, **LSLP** increases the compilation over **SLP** slightly, by less than 1%

Discussion

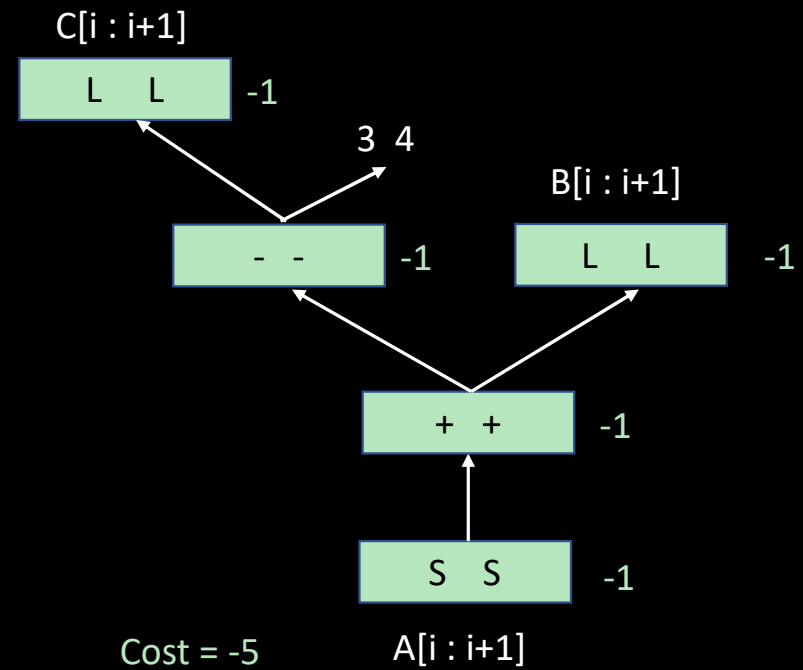
- LSLP introduces an effective scheme for dealing with commutative operations with little compilation time overhead.
- There are certain cases that LSLP can fail, which can be further improved.

Q&A

How SLP works



```
long A[], B[], C[];
A[i+0] = B[i+0] + (C[i+0] - 3);
A[i+1] = (C[i+1] - 4) + B[i+1];
```



Scalar IR

Find seed instructions for vectorization

Get next seed group

Generate the SLP graph

Calculate cost of vectorization

No
Cost < threshold

Yes

Replace scalars with vectors

Emit insert/extract instructions

Remove current seed group

Seeds left?

Yes

No

long A[], B[], C[];

A[i+0] = B[i+0] + (C[i+0] - 3);

A[i+1] = (C[i+1] - 4) + B[i+1];

C[i : i+1]

L L -1

3 4

B[i : i+1]

L L -1

+ + -1

S S -1

Cost = -5

A[i : i+1]