Optimistic Loop Optimization

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Motivating Example

```
for (i = 0; i < N; i++)
A[i] = A[N + i];</pre>
```

 Read Set (R)
 Write Set (W)

 { A[N + i] | $0 \le i < N$ }
 { A[i] | $0 \le i < N$ }

Read Set (R) Write Set (W) { $A[N + i] | 0 \le i < N$ } { $A[i] | 0 \le i < N$ }

$$\mathsf{R} \cap \mathsf{W} = \{ \}$$

 Read Set (R)
 Write Set (W)

 { A[N + i] | $0 \le i < N$ }
 { A[i] | $0 \le i < N$ }

 $R \cap W = \{ \}$ Parallel

```
unsigned char i, N;
```

```
for (i = 0; i < N; i++)
 A[i] = A[N + i];
```

Read Set (**R**) Write Set (W) $\{ A[N + i] | 0 < i < N \}$ $\{ A[i] | 0 < i < N \}$

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unsigned char i, N;
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```
for (i = 0; i < N; i++)
  A[i] = A[N + i];
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Read Set (**R**) $\{A[N + i] | 0 < i < N\}$ { A[i] | 0 < i < N }

Write Set (W)

```
unsigned char i, N;
```

```
for (i = 0; i < N; i++)
A[i] = A[N + i];</pre>
```

Read Set (R) $\{ A[N + i] \mid 0 \le i < N \}$ $\{ A[(N + i) \mod 256] \mid ... \}$

Write Set(W) { A[i] | 0 ≤ i < N }

```
unsigned char i, N;
```

```
for (i = 0; i < N; i++)
A[i] = A[N + i];</pre>
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 Read Set (R)
 Write Set (W)

 $\{ A[N + i] | 0 \le i < N \}$ $\{ A[i] | 0 \le i < N \}$
 $\{ A[(N + i) \mod 256] | ... \}$
 $R \cap W = \{ \}$, iff N <= 128</td>

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A[i] = A[N + i];</pre>
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 Read Set (R)
 Write Set (W)

 $\{ A[N + i] | 0 \le i < N \}$ $\{ A[i] | 0 \le i < N \}$
 $\{ A[(N + i) \mod 256] | ... \}$ $\{ A[O = 128 \}$
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 Potentially Sequential

Problem Statement

Program abstractions that capture *all possible semantics*

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Reality:

Corner cases are often missed or assumed not to happen

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Poor applicability and miscompilations for certain inputs

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Poor applicability and miscompilations for certain inputs

Solution:

Take optimistic assumptions statically that are verified dynamically

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OPTIMISTIC LOOP OPTIMIZATION

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/* loop nest */

1. Take Optimistic Assumptions to model the loop nest

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- **1.** Take *Optimistic Assumptions* to model the loop nest
- 2. Optimize the loop nest

```
/* optimized loop nest */
```

```
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```

- **1.** Take *Optimistic Assumptions* to model the loop nest
- 2. Optimize the loop nest
- 3. Version the code

```
if (
   /* optimized loop nest */
else
   /* loop nest */
```

- **1.** Take *Optimistic Assumptions* to model the loop nest
- 2. Optimize the loop nest
- 3. Version the code
- 4. Create a *simple* runtime check

```
if (/* simple runtime check */)
   /* optimized loop nest */
else
   /* loop nest */
```

C LLVM-IR Polyhedral Model

C	LLVM-IR	Polyhedral Model
Variant Loads in Control Conditions		
\checkmark	\checkmark	×

C	LLVM-IR	Polyhedral Model
Variant Loads in Control Cond	litions	
\checkmark	\checkmark	×
Aliasing Arrays		
\checkmark	\checkmark	×

C	LLVM-IR	Polyhedral Model
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Integer Wrapping		
\checkmark	\checkmark	×

C	LLVM-IR	Polyhedral Model
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Out-of-Bound Accesses		
\checkmark	\checkmark	×

С	LLVM-IR	Polyhedral Model
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\checkmark	\checkmark	×
Integer Wrapping		
\checkmark	\checkmark	×
Out-of-Bound Accesses		
\checkmark	\checkmark	×
Potentially Unbounded Loops		
\checkmark	\checkmark	×

Real World Example

NAS Parallel Benchmark Suite – BT – compute_rhs

- ▶ 66 loops, nested up to depth 4
- ▶ 38 array writes, 294 array reads
- ▶ 45 reads in loop bounds

```
for (j = 0; j < grid[0] + 1; j++)</pre>
```

```
for (i = 0; i < grid[1] + 1; i++)
for (m = 0; m < 5; m++)</pre>
```

rhs[j][i][m] = /* ... */;

```
for (j = 0; j < grid[0] + 1; j++)
for (i = 0; i < grid[1] + 1; i++)
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rhs[j][i][m] = /* ... */;

(a) Loads in control and access functions are invariant

```
for (j = 0; j < grid[0] + 1; j++)
for (i = 0; i < grid[1] + 1; i++)
for (m = 0; m < 5; m++)</pre>
```

rhs[j][i][m] = /* ... */;

(a) Loads in control and access functions are invariant(b) No aliasing/overlapping arrays

```
for (j = 0; j < grid[0] + 1; j++)
for (i = 0; i < grid[1] + 1; i++)
for (m = 0; m < 5; m++)
assume &rhs[j][i][m] >= &grid[2] ||
     &rhs[j][i][m + 1] <= &grid[0];
rhs[j][i][m] = /* ... */;</pre>
```

(a) Loads in control and access functions are invariant(b) No aliasing/overlapping arrays

(c) Expressions do not wrap
```
assume grid[0] != MAX_VALUE;
for (j = 0; j < grid[0] + 1; j++)
 assume grid[1] != MAX_VALUE:
  for (i = 0; i < grid[1] + 1; i++)
   for (m = 0; m < 5; m++)
      assume &rhs[j][i][m] >= &grid[2] ||
             &rhs[j][i][m + 1] <= &grid[0];
      rhs[i][i][m] = /* ... */:
```

(c) Expressions do not wrap

 $\llbracket e \rrbracket_{\mathbb{Z}}$

$$\llbracket e \rrbracket_{\mathbb{Z}} \quad \llbracket e \rrbracket_{\mathbb{Z}_{2^m}/\mathbb{Z}}$$

 $[\![e]\!]_{\mathbb{Z}} \neq [\![e]\!]_{\mathbb{Z}_{2^m}/\mathbb{Z}}$

(c) Expressions do not wrap

$$\mathcal{I}_{W}(\mathbf{e}) = \{(\underline{i}) \mid \llbracket \mathbf{e} \rrbracket_{\mathbb{Z}} \neq \llbracket \mathbf{e} \rrbracket_{\mathbb{Z}_{2^m}/\mathbb{Z}}\}$$

$$\mathcal{I}_{\mathsf{W}}(\mathsf{e}) = \{(\underline{i}) \mid [\![\mathsf{e}]\!]_{\mathbb{Z}} \neq [\![\mathsf{e}]\!]_{\mathbb{Z}_{2^m}/\mathbb{Z}}\}$$

Let e be *textually* part of statement S with domain \mathcal{I}_S .

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 $\mathcal{I}_{{}^{_{\!\!\mathcal W_S}}}(e)=\mathcal{I}_{{}^{_{\!\!\mathcal W}}}(e)\cap\mathcal{I}_{{}^{_{\!\!\mathcal S}}}$

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 $\mathcal{I}_{\scriptscriptstyle{W_S}}(e) = \mathcal{I}_{\scriptscriptstyle{W}}(e) \cap \mathcal{I}_{\scriptscriptstyle{S}}$

 $\mathcal{I}_{W_s}(\mathbf{e})$ describes executed *loop instances* for which \mathbf{e} will wrap.

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 $\mathcal{I}_{W_s}(\mathbf{e})$ describes executed *loop instances* for which \mathbf{e} will wrap.

 $\neg \mathcal{I}_{W_s}(e)$ describes sufficient *constrains* under which e will not wrap.

```
assume grid[0] != MAX_VALUE:
for (j = 0; j < grid[0] + 1; j++)
  assume grid[1] != MAX VALUE:
  for (i = 0; i < grid[1] + 1; i++)
   for (m = 0; m < 5; m++)
      assume &rhs[j][i][m] >= &grid[2] ||
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      assume &rhs[j][i][m] >= &grid[2] ||
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      rhs[j][i][m] = /* ... */;
```

(d) Accesses stay in-bounds

```
assume grid[0] != MAX_VALUE:
for (j = 0; j < grid[0] + 1; j++)
  assume grid[1] != MAX_VALUE;
  for (i = 0; i < grid[1] + 1; i++)
    for (m = 0; m < 5; m++)
      assume i < JMAX && i < IMAX:
      assume &rhs[j][i][m] >= &grid[2] ||
             &rhs[j][i][m + 1] <= &grid[0]:
      rhs[j][i][m] = /* ... */;
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```

Hoist, Combine & Simplify Assumptions

```
assume grid[0] != MAX_VALUE;
for (j = 0; j < grid[0] + 1; j++)
  assume grid[1] != MAX_VALUE:
  for (i = 0; i < grid[1] + 1; i++)
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      assume j < JMAX && i < IMAX;
      assume &rhs[j][i][m] >= &grid[2] ||
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      rhs[j][i][m] = /* ... */;
```

Constraints: $0 \le j \le grid[0]$ Assumption:

j < JMAX

```
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  for (i = 0; i < grid[1] + 1; i++)
    for (m = 0; m < 5; m++)
      assume i < JMAX && i < IMAX:
      assume &rhs[j][i][m] >= &grid[2] ||
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```

Constraints: $0 \le j \le grid[0]$ Assumption: grid[0] < JMAX $\implies j < JMAX$ Assumptions are Presburger Formulae

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Quantifier elimination is used to eliminate loop variables.

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Quantifier elimination is used to eliminate loop variables.

The result is a *pre-condition* of the original assumption.

```
assume grid[0] != MAX_VALUE &&
  grid[1] != MAX_VALUE &&
  grid[0] + 1 <= JMAX &&
  grid[1] + 1 <= IMAX &&
  (&rhs[0][0][0] >= &grid[2] ||
     &rhs[grid[0]][grid[1]][5] <= &grid[0]);</pre>
```

```
for (j = 0; j < grid[0] + 1; j++)
for (i = 0; i < grid[1] + 1; i++)
for (m = 0; m < 5; m++)
    rhs[j][i][m] = /* ... */;</pre>
```

ASSUMPTION SIMPLIFICATION

Eliminate Redundant Constraints: assume N < 128 && N < 127; => assume N < 127;

```
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assume N < 128 && N < 127;

=>

assume N < 127;
```

Approximate Complicated Constraints:

assume $\&B[N + 2 - ((N - 1) \% 3)] \le \&A[0] || \\ \&A[N + 2 - ((N - 1) \% 3)] \le \&B[0];$

```
Eliminate Redundant Constraints:

assume N < 128 && N < 127;

=>

assume N < 127;
```

Approximate Complicated Constraints:

Evaluation

	SPEC 2006	SPEC 2000
No Variant Loads Λ :	553	6
No Aliasing Λ :	132	52
No Wrapping Λ :	611	82
No Out-Of-Bounds Λ :	5	6
No Unbounded Loop Λ :	42	6
Total:	1343	152

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After Simplification:	< 671 (or < 50%)	< 99 (or < 66%)

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No Out-Of-Bound	Out-Of-Bound increased compile time by	
No Unbounded Loo	3 - 3000%	6
Т	5 - 500070.	152
After Simplification:	< 671 (or < 50%)	< 99 (or < 66%)

SPEC 2006

	w/o A ssumptions	w/ Assumptions	
modeled:	35	191	$\times 5.45$
feasible:	35	102	×2.91
executed:	61k	5.2M	$\times 85.24$
valid:	61k	99.68% * 5.2M	×85.21

SPEC 2000

	w/o A ssumptions	w/ Assumptions	
modeled:	24	83	×3.45
feasible:	24	78	×3.25
executed:	11k	729k	×66.27
valid:	11k	89.3% * 729k	×59.18

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SPEC 2006

	w/o A ssump	tions	w/ A ssump	tions	
modeled:	Δε	Assumptions fail $\approx 2\%$		191	×5.45
feasible:	AS.			102	$\times 2.91$
executed:				5.2M	$\times 85.24$
valid:	ofthe	of the time and cause		5.2M	×85.21
		< 4 % runtime overhead.			
	run			tions	
modeled:		24		83	×3.45
feasible:		24		78	×3.25
executed:		11k		729k	$\times 66.27$
valid:		11k	89.3% *	• 729k	$\times 59.18$

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Conclusion













Thank You.

Backup

Infinite loops create unbounded optimization problems

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```
for (unsigned i = 0; i != N; i+=2)
        A[i+4] = A[i];
```

FINITE LOOP ASSUMPTION

Infinite loops create unbounded optimization problems

```
if (N % 2 == 0) {
```

```
for (unsigned i = 0; i != N; i+=2)
    A[i+4] = A[i];
```

```
} else {
   /* original code */
}
```

INVARIANT LOAD ASSUMPTIONS

```
for (i = 0; i < *Size1; i++)
for (j = 0; j < *Size0; j++)
...</pre>
```

```
auto Size0V, Size1V = *Size1;
```

```
if (Size1V > 0)
Size0V = *Size0;
```

```
for (i = 0; i < Size1V; i++)
for (j = 0; j < Size0V; j++)
...</pre>
```

Hoist invariant loads but keep control conditions intact.

```
auto Size0V, Size1V = *Size1;
```

```
if (Size1V > 0)
Size0V = *Size0;
```

```
for (i = 0; i < Size1V; i++)
for (j = 0; j < Size0V; j++)
...</pre>
```

Hoist invariant loads but *keep control conditions* intact. Powerful *in combination* with *runtime alias checks*.

Simplify Complicated Constraints:

assume
$$\&B[N + 2 - ((N - 1) \% 3)] <= \&A[0] || \\ \&A[N + 2 - ((N - 1) \% 3)] <= \&B[0];$$

```
assume &B[N + 2] <= &A[0] ||
&A[N + 2] <= &B[0];
```

```
for (i = 0; i < N; i += 3) {
    A[i + 0] += 1.3 * B[i + 0];
    A[i + 1] += 1.7 * B[i + 1];
    A[i + 2] += 2.1 * B[i + 2];</pre>
```

}

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```
SPEC 2006 – 456.hmmer – P7_Viterbi
–28% execution time
```

NAS Parallel Benchmark Suite – BT – compute_rhs 6× fold speedup with 8 threads [Metha and Yew, PLDI'15]

Rust	Java	С	LLVM-IR	Polyhedral Model
Variant Loads in Control Conditions				
\checkmark	\checkmark	\checkmark	\checkmark	×
Aliasing Arrays				
×	×	\checkmark	\checkmark	×
Integer Wrapping				
\checkmark	\checkmark	\checkmark	\checkmark	×
Out-of-Bound Accesses				
\checkmark	\checkmark	\checkmark	\checkmark	×
Potentially Unbounded Loops				
\checkmark	\checkmark	\checkmark	\checkmark	×