## Optimistic Loop Optimization

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Motivating Example

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


## A Potentially Parallel Loop

$$
\begin{aligned}
\text { for }(i & =0 ; i<N ; i++) \\
A[i] & =A[N+i] ;
\end{aligned}
$$

Read Set (R)
$\{\mathrm{A}[\mathrm{N}+\mathrm{i}] \mid 0 \leq \mathrm{i}<\mathrm{N}\}$

Write Set (W)
\{ $A[i] \mid 0 \leq i<N\}$

## A Potentially Parallel Loop

$$
\begin{aligned}
& \text { for (i }=0 ; i<N ; i++) \\
& \qquad \begin{aligned}
& A[i]=A[N+i] ; \\
& \text { Read Set (R) } \\
&\{A[N+i] \mid 0 \leq i<N\} \text { Write Set (W) } \\
&\{A[i] \mid 0 \leq i<N\} \\
& R \cap W=\{ \}
\end{aligned}
\end{aligned}
$$

## A Potentially Parallel Loop

$$
\begin{aligned}
& \text { for (i = 0; i }<\mathrm{N} \text {; i++) } \\
& A[i]=A[N+i] ; \\
& \text { Read Set (R) } \\
& \{\mathrm{A}[\mathrm{~N}+\mathrm{i}] \mid 0 \leq \mathrm{i}<\mathrm{N}\} \\
& \text { Write Set (w) } \\
& \text { \{ } A[i] \mid 0 \leq i<N\}
\end{aligned}
$$

## A Potentially Parallel Loop

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

Read Set (R)
$\{\mathrm{A}[\mathrm{N}+\mathrm{i}] \mid 0 \leq \mathrm{i}<\mathrm{N}\}$

Write Set (W)
\{ $A[i] \mid 0 \leq i<N\}$

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unsigned char i, N;
for (i = 0; i < N; i++)
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Write Set (W)
\{ A[i] | $0 \leq i<N\}$

## A Potentially Parallel Loop

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

Read Set (R)

\{ $A[(N+i) \bmod 256] \mid \ldots\}$

Write Set (W)
\{ A[i] | $0 \leq i<N\}$

## A Potentially Parallel Loop

```
unsigned char i, N;
for (i = 0; i < N; i++)
    A[i] = A[N + i];
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Write Set (W)
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R \cap W=\{ \}, \text { iff } N<=128
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\{ A[i] | $0 \leq i<N\}$
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Potentially Sequential

## Problem Statement

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## Solution:

Take optimistic assumptions statically that are verified dynamically

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## Optimistic Loop Optimization

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## /* loop nest */

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/* optimized loop nest */
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3. Version the code
```
if ( )
    /* optimized loop nest */
else
    /* loop nest */
```


## Optimistic Loop Optimization

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 */
```


## SEMANTIC DIFFERENCES

## Semantic Differences

| C | LLVM-IR | Polyhedral Model |
| :---: | :---: | :---: |
| Variant Loads in Control Conditions |  | $\boldsymbol{X}$ |

## Semantic Differences



## Semantic Differences



## Semantic Differences



## Semantic Differences



## Real World Example

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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


## Real World EXample

double rhs[JMAX][IMAX][5];

$$
\begin{aligned}
& \text { for }(j=0 ; j<\operatorname{grid}[0]+1 ; j++) \\
& \text { for }(i=0 ; i<\operatorname{grid}[1]+1 ; i++) \\
& \text { for }(m=0 ; m<5 ; m++)
\end{aligned}
$$

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

## Assumption Generation

double rhs[JMAX][IMAX][5];

$$
\begin{aligned}
& \text { for }(j=0 ; j<\operatorname{grid}[0]+1 ; j++) \\
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& \quad \text { for }(m=0 ; m<5 ; m++)
\end{aligned}
$$

$$
\text { rhs[j][i][m] }=/ * \ldots * / ;
$$

(a) Loads in control and access functions are invariant

## Assumption Generation

double rhs[JMAX][IMAX][5];
for ( $\mathrm{j}=0 ; \mathrm{j}<\operatorname{grid}[0]+1$; $\mathrm{j}++$ )

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\begin{aligned}
& \text { for }(i=0 ; i<\operatorname{grid}[1]+1 ; i++) \\
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$$

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\text { rhs[j][i][m] }=/ * \ldots * / ;
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(a) Loads in control and access functions are invariant (b) No aliasing/overlapping arrays

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$$

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

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

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double rhs[JMAX][IMAX][5];

$$
\begin{aligned}
& \text { for }(j=0 ; j<\operatorname{grid}[0]+1 ; j++) \\
& \text { for }(i=0 ; i<\operatorname{grid}[1]+1 ; i++) \\
& \text { for }(m=0 ; m<5 ; m++) \\
& \text { assume \&rhs[j][i][m]>= \&grid[2] || } \\
& \quad \& r h s[j][i][m+1]<=\& g r i d[0] ; \\
& \quad \operatorname{rhs}[j][i][m]=/ * \ldots * / ;
\end{aligned}
$$

(c) Expressions do not wrap

## Assumption Generation

```
double rhs[JMAX][IMAX][5];
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[j][i][m] = /* ... */;
```

(c) Expressions do not wrap

Given an expression e with $m$ bits:
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## No Wrapping Assumptions

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$$
\llbracket e \rrbracket_{z}
$$

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Given an expression e with $m$ bits:

$$
\llbracket \mathrm{e} \rrbracket_{z} \quad \llbracket \mathrm{e} \rrbracket_{\mathbb{Z}_{2^{n}} / \mathbb{Z}}
$$

## (c) Expressions do not wrap

## No Wrapping Assumptions

Given an expression e with $m$ bits:

$$
\llbracket \mathbb{e} \rrbracket_{z} \neq \llbracket \mathbb{e} \rrbracket_{\mathbb{Z}_{2 n} / \mathbb{Z}}
$$

(c) Expressions do not wrap

## No Wrapping Assumptions

Given an expression e with $m$ bits:

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

Let e be textually part of statement S with domain $\mathcal{I}_{\mathrm{S}}$.
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$$

Let e be textually part of statement $S$ with domain $\mathcal{I}_{\text {S }}$.

$$
\mathcal{I}_{W_{\mathrm{S}}}(\mathrm{e})=\mathcal{I}_{W}(\mathrm{e}) \cap \mathcal{I}_{\mathrm{S}}
$$

(c) Expressions do not wrap

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Given an expression e with $m$ bits:

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$\mathcal{I}_{w_{s}}(\mathrm{e})$ describes executed loop instances for which e will wrap.
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\mathcal{I}_{W_{\mathrm{S}}}(\mathrm{e})=\mathcal{I}_{W}(\mathrm{e}) \cap \mathcal{I}_{\mathrm{S}}
$$

$\mathcal{I}_{w_{s}}(\mathrm{e})$ describes executed loop instances for which e will wrap.
$\neg \mathcal{I}_{w_{s}}(\mathrm{e})$ describes sufficient constrains under which e will not wrap.
(c) Expressions do not wrap

## Assumption Generation

double rhs[JMAX][IMAX][5];

```
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[j][i][m] = /* ... */;
    
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(d) Accesses stay in-bounds

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    assume grid[1] != MAX_VALUE;
    for (i = 0; i < grid[1] + 1; i++)
        for (m = 0; m < 5; m++)
        assume j < 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

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Constraints: $0 \leq j \leq \operatorname{grid}[0]$ Assumption:

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

Constraints: $0 \leq j \leq \operatorname{grid}[0]$
Assumption: grid[0] < JMAX $\Longrightarrow j<J M A X$

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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.

## Assumption Hoisting

double rhs[JMAX][IMAX][5];

```
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]);
```

for (j = 0; j < grid[0] + 1; j++)
for ( $\mathrm{i}=0 ; \mathrm{i}<\operatorname{grid[1]}+1 ; \mathrm{i}++$ )
for ( $m=0 ; m<5 ; m++$ )
rhs[j][i][m] = /* ... */;

## ASSUMPTION SIMPLIFICATION

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


## AsSumption Simplification

```
Eliminate Redundant Constraints:
assume N < 128 && N < 127;
=>
assume N < 127;
Approximate Complicated Constraints:
assume &B[N + 2 - ((N - 1) % 3)] <= &A[0] ||
    &A[N + 2 - ((N - 1) % 3)] <= &B[0];
```


## AsSumption Simplification

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

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

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

```

\section*{Evaluation}

\section*{Assumption Statistics}
\begin{tabular}{rrr} 
& SPEC 2006 & SPEC 2000 \\
\cline { 2 - 3 } No Variant Loads ^: & 553 & 6 \\
No Aliasing ^: & 132 & 52 \\
No Wrapping ^: & 611 & 82 \\
No Out-Of-Bounds ^: & 5 & 6 \\
No Unbounded Loop ^: & 42 & 6 \\
Total: & 1343 & 152
\end{tabular}

\section*{ASSUMPTION STATISTICS}
\begin{tabular}{rrr} 
& SPEC 2006 & SPEC 2000 \\
No Variant Loads \(\Lambda:\) & 553 & 6 \\
No Aliasing \(\wedge:\) & 132 & 52 \\
No Wrapping \(\wedge:\) & 611 & 82 \\
No Out-Of-Bounds \(\Lambda:\) & 5 & 6 \\
No Unbounded Loop \(\wedge:\) & 42 & 6 \\
Total: & 1343 & 152 \\
After Simplification: & \(<671(\) or \(<50 \%)\) & \(<99(\) or \(<66 \%)\)
\end{tabular}

\section*{AsSumption Statistics}


\section*{APPLICABILITY \& VALIDITY}

\section*{SPEC 2006}
\(\begin{array}{rr|r|r} & \text { w/o ^ssumptions } & \text { w/ ^ssumptions } & \\\)\cline { 2 - 4 } \text { modeled: } & 35 & 191 & \(\left.\times 5.45 \\ \text { feasible: } & 35 & 102 & \times 2.91 \\ \text { executed: } & 61 \mathrm{k} & 5.2 \mathrm{M} & \times 85.24 \\ \text { valid: } & 61 \mathrm{k} & & 99.68 \% * 5.2 \mathrm{M}\end{array}\right) \times 85.21\)

\section*{SPEC 2000}
\(\begin{array}{rr|r|r} & \text { w/o ^ssumptions } & \text { w/ Mssumptions } & \\\)\cline { 2 - 4 } & 24 & 83 & \(\left.\times 3.45 \\ \text { feasible: } & 24 & 78 & \times 3.25 \\ \text { executed: } & 11 \mathrm{k} & 729 \mathrm{k} & \times 66.27 \\ \text { valid: } & 11 \mathrm{k} & & 89.3 \% * 729 \mathrm{k}\end{array}\right) \times 59.18\)

SPEC 2006
\begin{tabular}{|c|c|c|c|}
\hline \multirow[b]{5}{*}{modeled: feasible executed valid:} & w/o ^ssumptions & / ^ssumptions & \\
\hline & \multirow[t]{2}{*}{Assumptions fail} & 191 & \(\times 5.45\) \\
\hline & & 102 & \(\times 2.91\) \\
\hline & \(\approx 2 \%\) & 5.2 M & \(\times 85.24\) \\
\hline & \multicolumn{2}{|l|}{of the time and cause} & \(\times 85.21\) \\
\hline & & & \\
\hline & runtime & tions & \\
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\hline
\end{tabular}

\section*{Conclusion}

\section*{Architecture Overview}


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\section*{Thank You.}

Backup

Infinite loops create unbounded optimization problems

\section*{Finite Loop Assumption}

Infinite loops create unbounded optimization problems
\[
\begin{aligned}
& \text { for (unsigned } i=0 ; i \quad!=N ; i+=2) \\
& \qquad A[i+4]=A[i] ;
\end{aligned}
\]

\section*{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 */
}

```

\section*{InVARIANT LOAD Assumptions}
```

for (i = 0; i < *Size1; i++)
for (j = 0; j < *Size0; j++)

```
...

\section*{Invariant Load Assumptions}
```

auto Size0V, Size1V = *Size1;
if (Size1V > 0)
Size0V = *Size0;
for (i = 0; i < Size1V; i++)
for (j = 0; j < Size0V; j++)

```

Hoist invariant loads but keep control conditions intact.

\section*{Invariant Load Assumptions}
```

auto Size0V, Size1V = *Size1;
if (Size1V > 0)
Size0V = *Size0;
for (i = 0; i < Size1V; i++)
for (j = 0; j < Size0V; j++)
Hoist invariant loads but keep control conditions intact. Powerful in combination with runtime alias checks.

```

\section*{Assumption Simplification}

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];
}

```

\section*{SOUND \& AUTOMATIC POLYHEDRAL OPTIMIZATION}

Polyhedral optimizations show great performance improvements,

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Polyhedral optimizations show great performance improvements, though they often require manual pre-processing and are unsound for corner case inputs.

\section*{Sound \& Automatic Polyhedral Optimization}

Polyhedral optimizations show great performance improvements, though they often require manual pre-processing and are unsound for corner case inputs.

SPEC 2006-456.hmmer - P7_Viterbi
\(-28 \%\) execution time

NAS Parallel Benchmark Suite - BT - compute_rhs
\(6 \times\) fold speedup with 8 threads [Metha and Yew, PLDI'15]

\section*{Semantic Differences}
\begin{tabular}{cccc} 
Rust Java C & LLVM-IR & \begin{tabular}{c} 
Polyhedral \\
Model
\end{tabular}
\end{tabular}
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