

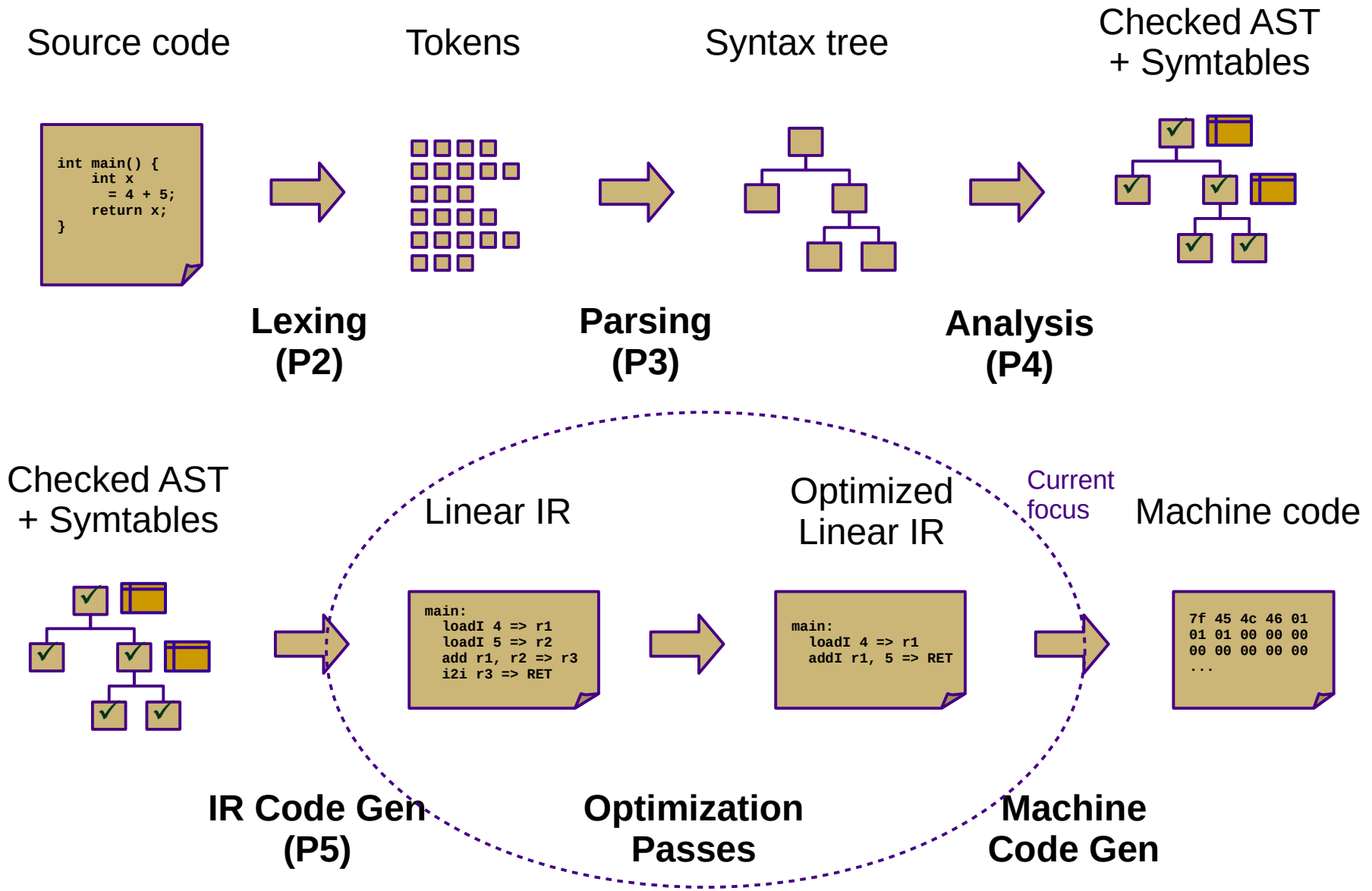
CS 432
Fall 2021

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Optimization

Compilers



Optimization is Hard

- **Problem:** it's hard to reason about all possible executions
 - Preconditions and inputs may differ
 - Optimizations should be correct and efficient in all cases
- Optimization tradeoff: **investment vs. payoff**
 - "Better than naïve" is fairly easy
 - "Optimal" is impossible
 - Real world: somewhere in between
 - Better speedups with more static analysis
 - Usually worth the added compile time
 - Requires working at multiple levels of granularity
 - Many active areas of research

Optimization (Ch. 8-11)

- **Local**

- Local value numbering (8.4.1)
- Tree-height balancing (8.4.2)
- Peephole optimization (11.5)

- **Regional**

- Superlocal value numbering (8.5.1)
- Loop unrolling (8.5.2)

- **Global**

- Constant propagation (9.3.6, 10.7.1)
- Dead code elimination (10.2)
- Global code placement (8.6.2)
- Lazy code motion (10.3)

- **Whole-program**

- Inline substitution (8.7.1)
- Procedure placement (8.7.2)

Asides:

Data-flow analysis (Ch. 9)

Liveness analysis (8.5.1, 9.2.2)

Single static assignment (9.3)

Local Value Numbering

- Detect and remove redundant computation
 - Assign distinct numbers to each value computed
 - Typically using a hashing scheme
 - Requires SSA (or some similar scheme)
 - Avoids removing incorrect “redundancies”

```
a = x
b = y
c = a + b;
d = a + b;
a = z;
e = a + b;
```

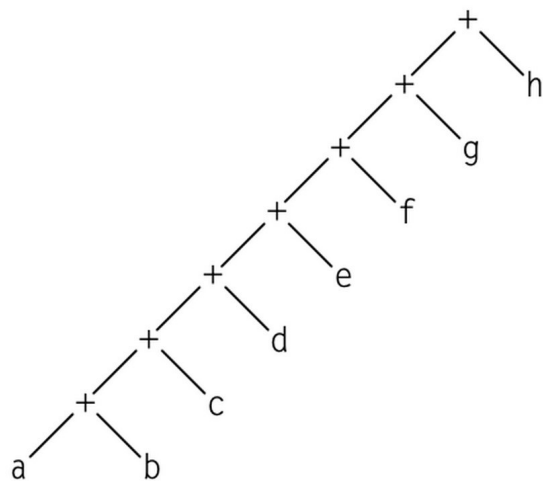
Original

```
a = x
b = y
c = a + b;
d = c;           // same number as c ( $a_0 + b$ )
a = z;
e = a + b;       // NOT the same number as c ( $a_1 + b$ )
```

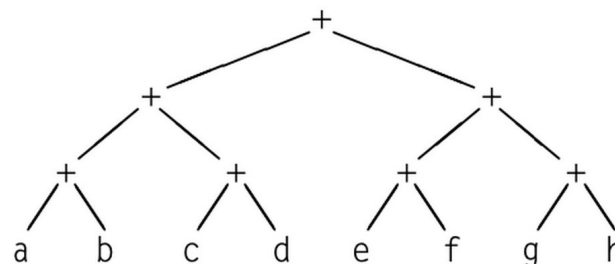
Optimized

Tree-Height Balancing

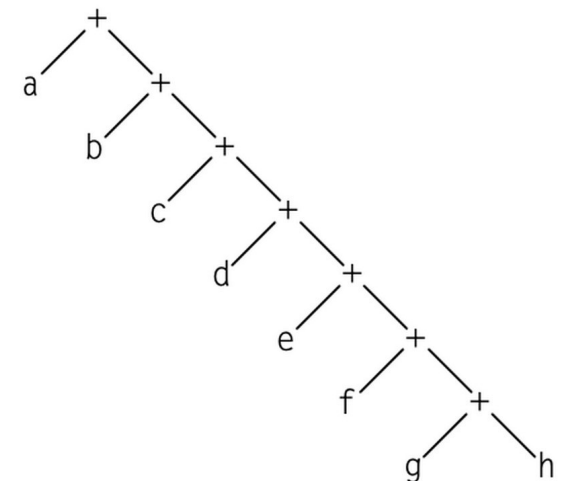
- Balance expression trees
 - Improves performance for CPUs with pipelining and/or multiple functional units (i.e., **instruction-level parallelism**)



(a) Left-Associative Tree



(b) Balanced Tree



(c) Right-Associative Tree

■ **FIGURE 8.5** Potential Tree Shapes for $a + b + c + d + e + f + g + h$.

Peephole Optimization

- Scan linear IR with sliding window ("peephole")
 - Look for common inefficient patterns
 - Replace with known equivalent sequences

Example:

```
storeAI r5 => [bp+8]
loadAI [bp+8] => r7
```



```
storeAI r5 => [bp+8]
i2i r5 => r7
```

Generalized pattern:

```
storeAI a => b
loadAI  b => c
```



```
storeAI a => b
i2i    a => c
```

Loop Unrolling

- Replace loop body with multiple copies
 - Reduces number of comparisons and nonlocal jumps
 - Exposes additional opportunities for other optimizations

```
for (int i=0; i<N; i++) {  
    do_something(i);  
}
```

Original

```
int i;  
for (i=0; i<N-4; i+=4) {  
    do_something(i);  
    do_something(i+1);  
    do_something(i+2);  
    do_something(i+3);  
}  
for (; i<N; i++) {  
    do_something(i);  
}
```

Unrolled by factor of 4

Profile: “Fran” Allen

- Frances Allen (b. 1932, d. 2020)
 - B.S. and M.S. in Mathematics
 - Worked at IBM, NYU, Stanford among others
 - First female IBM Fellow
 - First female ACM Turing Award recipient
 - Many foundational papers on optimizations and data flow analysis



Photo courtesy of Wikipedia

**A
CATALOGUE
OF
OPTIMIZING
TRANSFORMATIONS**

**Frances E. Allen ·
John Cocke**
IBM Thomas J. Watson Research Center
Yorktown Heights

Programming
Techniques

G. Manacher, S. Graham
Editors

**A Program Data Flow
Analysis Procedure**

F.E. Allen and J. Cocke
IBM Thomas J. Watson Research Center

Profile: Frances “Fran” Allen

1. *Loop Unrolling*. A loop can be unrolled completely so that the successive computations implied by the loop appear sequentially or it can be partially unrolled as in the following example:

```
DO I = 1 TO 100 BY 1;  
A(I) = A(I) + B(I);  
END;
```

becomes when unrolled by 2:

```
DO I = 1 TO 100 BY 2;  
A(I) = A(I) + B(I);  
A(I+1) = A(I+1) + B(I+1);  
END;
```

The advantages of loop unrolling are that

a. the number of instructions executed is reduced. In the preceding example the number of increments and tests for loop control is halved.

b. more instructions are exposed for parallel execution. The two statements in the unrolled form of the preceding example can be executed at the same time since they are independent.

Dead Code Elimination

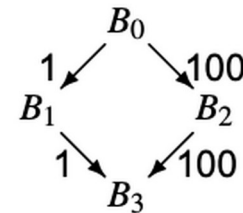
- Remove non-live definitions
 - Requires liveness analysis

```
int x = a + b;           // original
int y = a - b;
return x + 2;
```

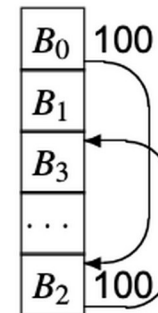
```
int x = a + b;           // reduced code size
return x + 2;
```

Global Code Placement

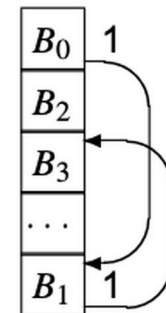
- Arrange basic blocks in order according to likely control flow at run time (**hot path**)
 - Takes advantage of code locality (lower cost of fallthrough vs. taken branches)
 - Requires profiling information
 - Build **chains** of hot paths



Hot path chains: $(B_0, B_2, B_3)_{100}, (B_1)_1$



Slow Layout



Fast Layout

Lazy Code Motion

- Move **loop-invariant** expressions out of loops
 - Combines three different dataflow analyses

```
// original
```

```
for (int i=0; i<nblocks; i++) {  
    a = sqrt(cos(b)+sin(b));  
    printf("%f\n", calc_something(a+(float)i));  
}
```

```
// optimized
```

```
a = sqrt(cos(b)+sin(b));  
for (int i=0; i<nblocks; i++) {  
    printf("%f\n", calc_something(a+(float)i));  
}
```

Tail Recursion Elimination

- Some recursive procedures can be converted to iterative procedures automatically
 - Avoids the overhead of multiple calls

```
// original
```

```
int fact(int n) {  
    if (n < 2) return 1;  
    return n * fact(n - 1);  
}
```

```
// tail-recursive version
```

```
int fact(int n) {  
    return fac_rec(1, n);  
}  
int fac_rec(int acc, int n) {  
    if (n < 2) return acc;  
    return fac_rec(n * acc, n - 1);  
}
```

```
// removed tail recursion
```

```
int fact_rec(int acc, int n) {  
loop:  
    if (n < 2) return acc;  
    acc *= n;  
    n--;  
    goto loop;  
}
```

```
// inlined and condition-inverted
```

```
int fact(int n) {  
    int acc = 1;  
    while (n > 1) {  
        acc *= n;  
        n--;  
    }  
    return acc;  
}
```

Inline Substitution

- Replace procedure call with callee's body
 - Avoids call overhead and exposes additional opportunities for other optimizations
 - **Decision procedure** to choose when to inline
 - Many potential criteria (callee/caller size, call count, etc.)

```
int foo(int x, int y) {  
    return x + bar(y);  
}  
int main() {  
    a = foo(1,2);  
    b = foo(3,4);  
    c = foo(5,6);  
    return a + b + c;  
}
```

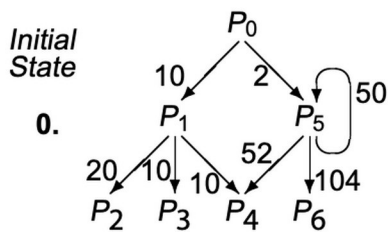
Original

```
int main() {  
    a = 1 + bar(2);  
    b = 3 + bar(4);  
    c = 5 + bar(6);  
    return a + b + c;  
}
```

Inlined foo into main

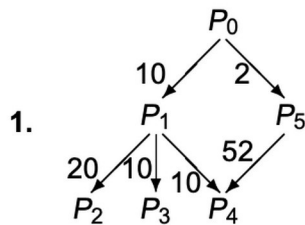
Procedure Placement

- Extension of global code placement to procedures
 - Uses **call graph** instead of control flow graph



	P_0	P_1	P_2	P_3	P_4	P_5	P_6
List(x)	{ P_0 }	{ P_1 }	{ P_2 }	{ P_3 }	{ P_4 }	{ P_5 }	{ P_6 }

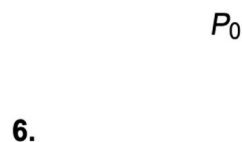
Q: $\{(P_5, P_6)_{104}, (P_5, P_4)_{52}, (P_1, P_2)_{20}, (P_1, P_4)_{10}, (P_1, P_3)_{10}, (P_0, P_1)_{10}, (P_0, P_5)_{2}\}$



	P_0	P_1	P_2	P_3	P_4	P_5	
List(x)	{ P_0 }	{ P_1 }	{ P_2 }	{ P_3 }	{ P_4 }	{ P_5, P_6 }	

Q: $\{(P_5, P_4)_{52}, (P_1, P_2)_{20}, (P_1, P_4)_{10}, (P_1, P_3)_{10}, (P_0, P_1)_{10}, (P_0, P_5)_{2}\}$

...



	P_0						
List(x)	{ $P_0, P_1, P_2, P_5, P_6, P_4, P_3$ }						

Q: \emptyset

Link-Time Optimization

- Most compilers focus on a portion of the program at a time
 - Called a **compilation unit** (often a single file, class, or procedure)
 - Provides straightforward parallelization
 - Obstructs whole-program optimizations
 - **Link-time optimization** looks at the entire program

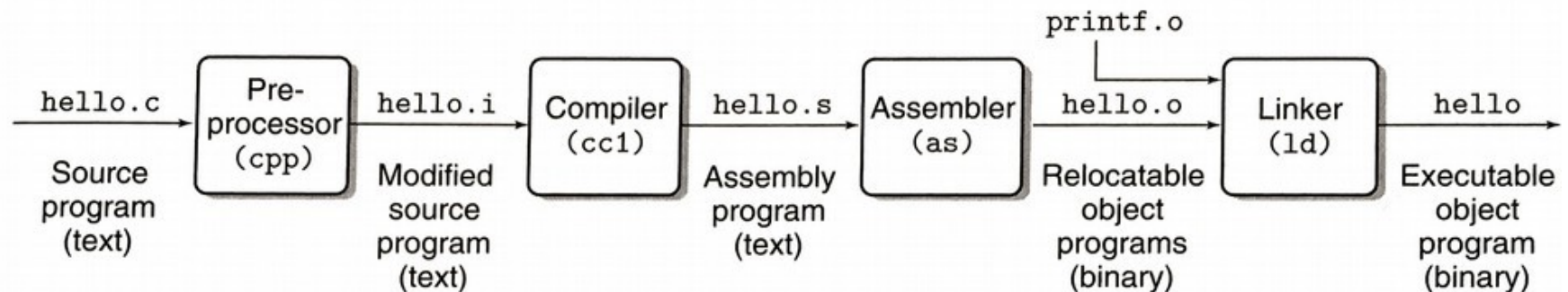


Figure 1.3 The compilation system.

Compiler Research

- Larger compilation units
 - What is the right balance?
- Smaller passes (e.g., **nanopasses**)
 - Allows for easy re-runs of passes
- **Gradual typing**: hybrid static & dynamic type checking
 - Some variables are annotated and checked statically
 - Others are checked at runtime
- **Incremental** compilation: cache IRs for future compilation
 - Improves re-compilation performance
- Integrated development environments (IDEs)
 - Greater collaboration w/ developer
 - Combination of systems and human-computer interaction (HCI)