

# Automatically Identifying Compiler Performance Anomalies

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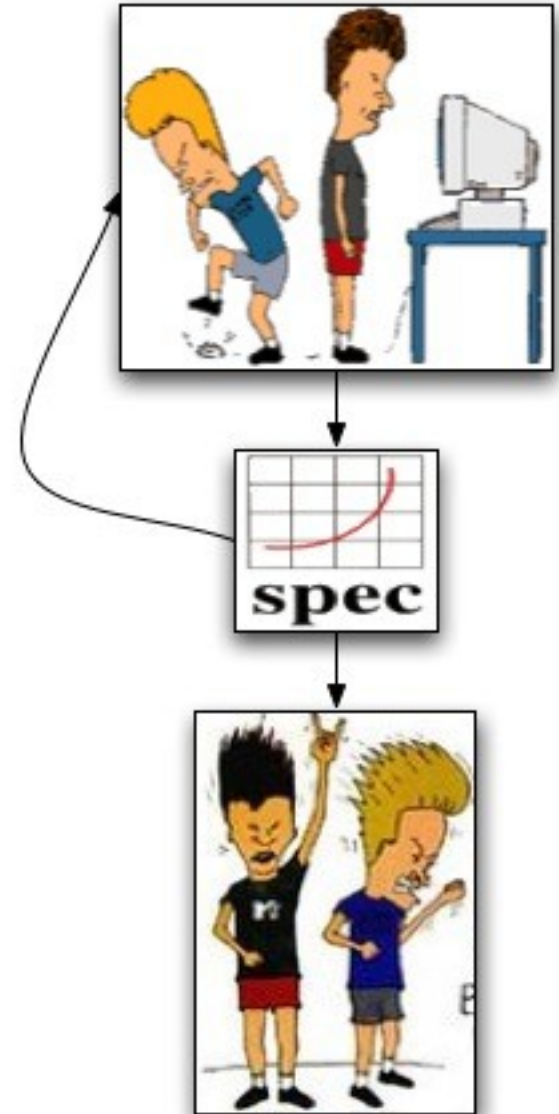
Ramesh Peri

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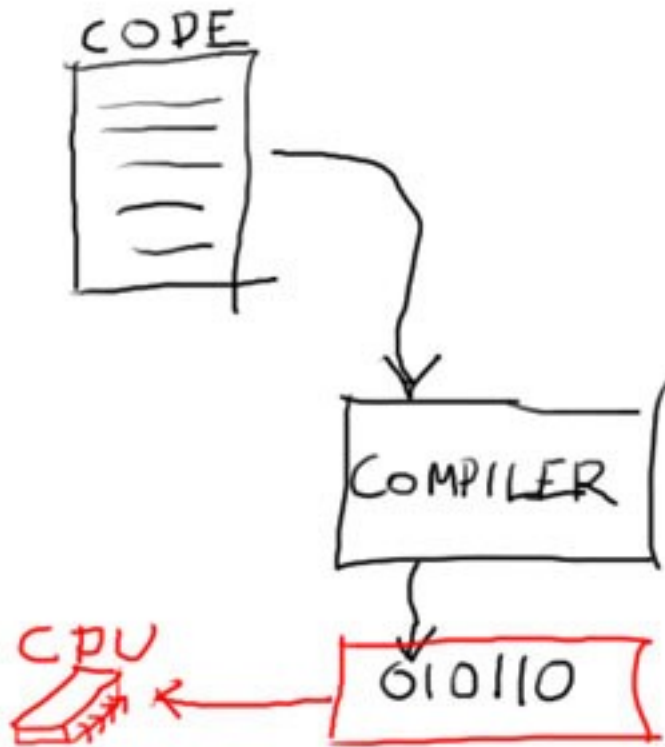
Intel

# Primitive Development Cycle for Compilers

- Come up with an idea
- Test it
- If nothing improved, go to 1
- Celebrate



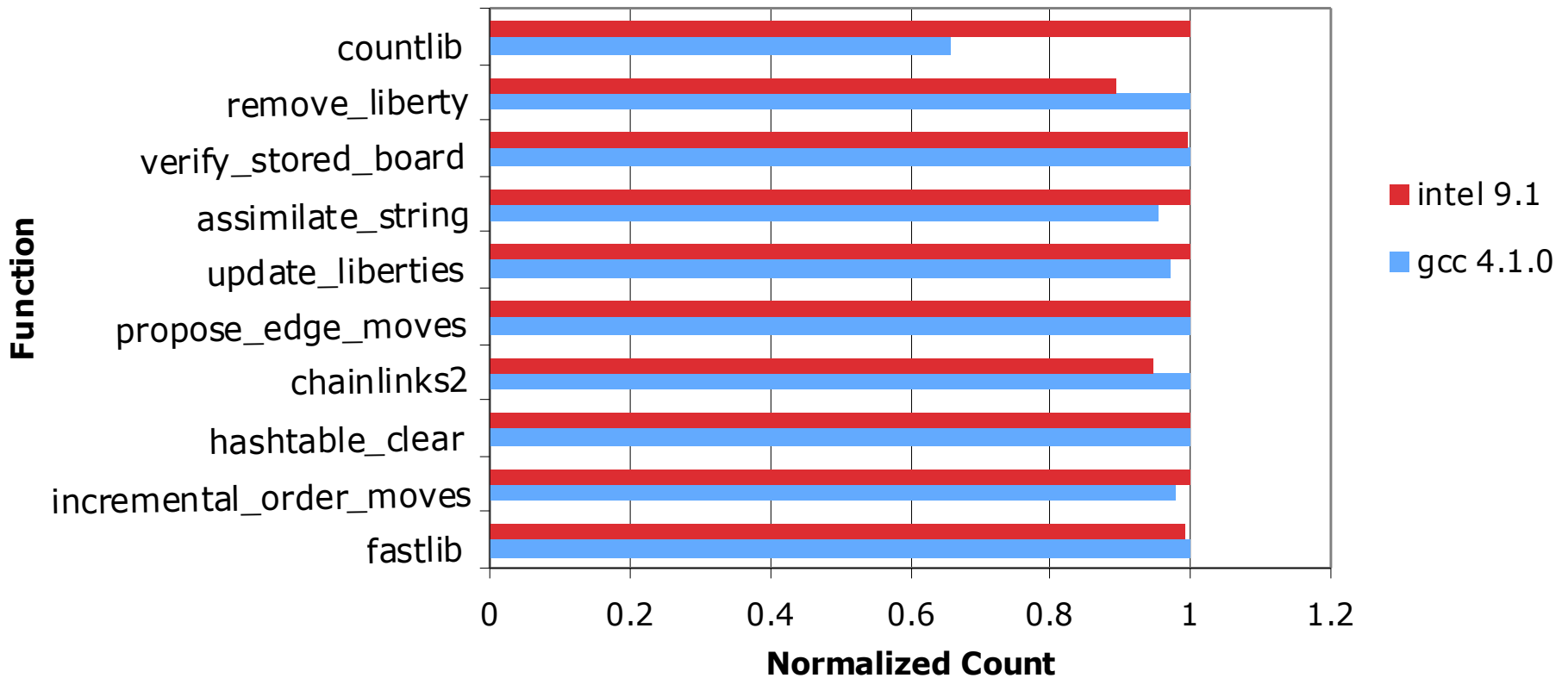
# Understanding transformations is hard



- Code size vs. control flow
  - Inlining, loop transformations, superblocks, if-conversion
- Architectural Features
  - Superscalar, OoO, speculation, EPIC, multilevel memory hierarchy, prefetching

# Unpredictable Results

**445.gobmk Jump Instruction Comparison**



# Unpredictable Interactions

- Dozens of optimizations and parameters
- Selecting per-bench parameters for gcc on SPEC improves performance by 6%
- Best overall loop unrolling factor for 132.jpeg is 2, but performance increases 8.81% if each function uses best parameter
- Iterative Compilation tries many combinations
  - Balances between compilation speed and search depth

# Outline

- Relative Profile Data Analysis (RPDM)
  - Methodology
  - Screenshots
- Case Studies
- General Observations
- Future Work

# Relative Profile Data Analysis

- Provide detailed metrics to measure impact of differently compiled benchmarks
  - Function-level comparison
- Usage scenarios
  - Identify missed opportunities and performance bugs
  - Understand impact of new optimizations
  - Regression testing

# Relative Profile Data Analysis

1. Collect instruction mix profiles for many benchmarks with multiple compilers and optimization flags
2. Populate database with profile data
3. Brute force query database to identify most significant outlier functions (e.g., total ins, FP ops, jumps, stack r/w, mem r/w)
4. Visually inspect interesting cases



## Step 1: Select some profiles (you probably want to select profiles for the same

	linux em64t gnu 4.1.0 shared -O2	linux em64t gnu 4.1.0 shared -O3-mtune	linux em64t intel 9.1 shared -O2	linux em64t intel 9.1 shared -O3-mtune	linux em64t intel 9.1 shared -fast	linux ia32 gnu 3.2.3 shared -O2	linux ia32 gnu 3.4.6 shared -O2	linux ia32 gnu 4.1.0 shared -O2	linux ia32 gnu 4.1.0 shared -O3-mtune	linux ia32 gnu 4.1.1 shared -O2_ref0	linux ia32 gnu 4.1.1 shared -O2_ref1
cpu2000/253.perlbnk/train/0										<input type="checkbox"/>	
cpu2000/253.perlbnk/train/1										<input type="checkbox"/>	
cpu2000/253.perlbnk/train/2										<input type="checkbox"/>	
cpu2000/253.perlbnk/train/3										<input type="checkbox"/>	
cpu2000/253.perlbnk/train/4										<input type="checkbox"/>	
cpu2000/253.perlbnk/train/5										<input type="checkbox"/>	
cpu2000/253.perlbnk/train/6										<input type="checkbox"/>	
cpu2006/400.perlbench/train/0	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>		
cpu2006/400.perlbench/train/1	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>		
cpu2006/400.perlbench/train/2	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>		
cpu2006/400.perlbench/train/3	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>		
cpu2006/400.perlbench/train/4	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>		
cpu2006/401.bzip2/train/0	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>		
cpu2006/401.bzip2/train/1	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>		
cpu2006/401.bzip2/train/2	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>		
cpu2006/403.gcc/train/0	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>				
cpu2006/410.bwaves/train/0	<input type="checkbox"/>	<input type="checkbox"/>						<input type="checkbox"/>	<input type="checkbox"/>		
cpu2006/416.gamess/train/0								<input type="checkbox"/>	<input type="checkbox"/>		
cpu2006/429.mcf/train/0	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>		
cpu2006/433.milc/train/0	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>		
cpu2006/434.zeusmp/train/0							<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>		
cpu2006/435.gromacs/train/0	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>		<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>		

Select a query:

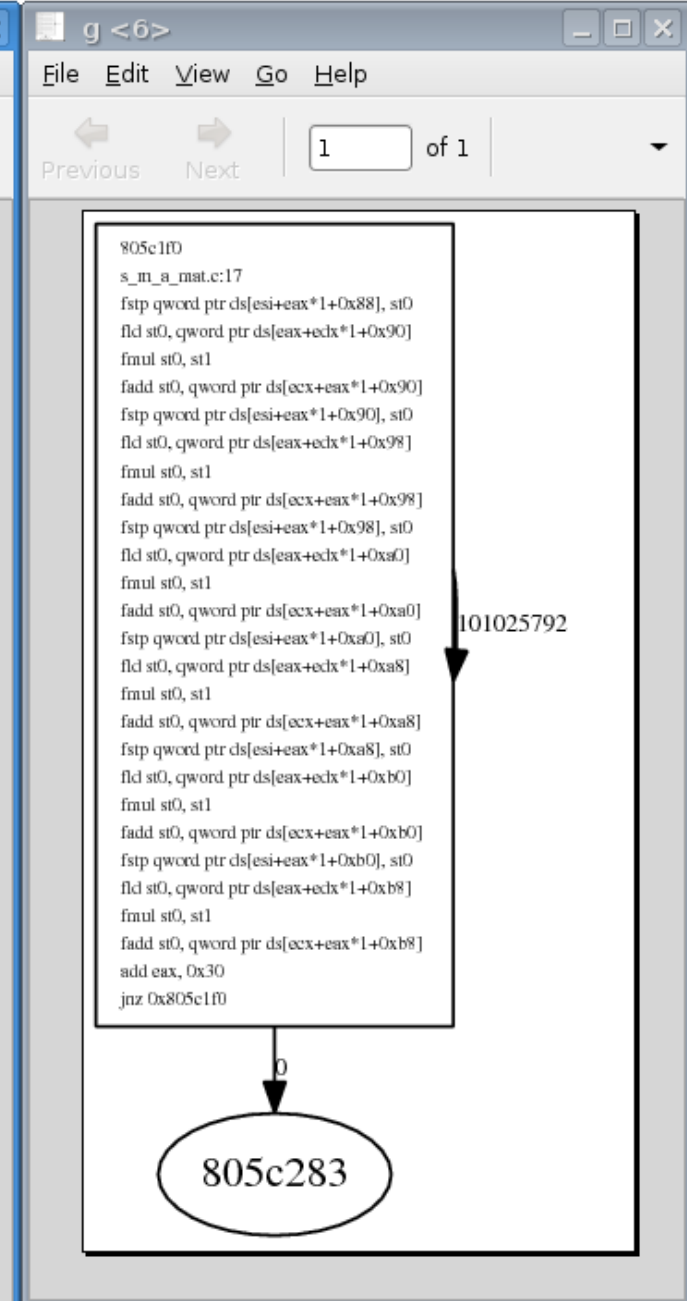
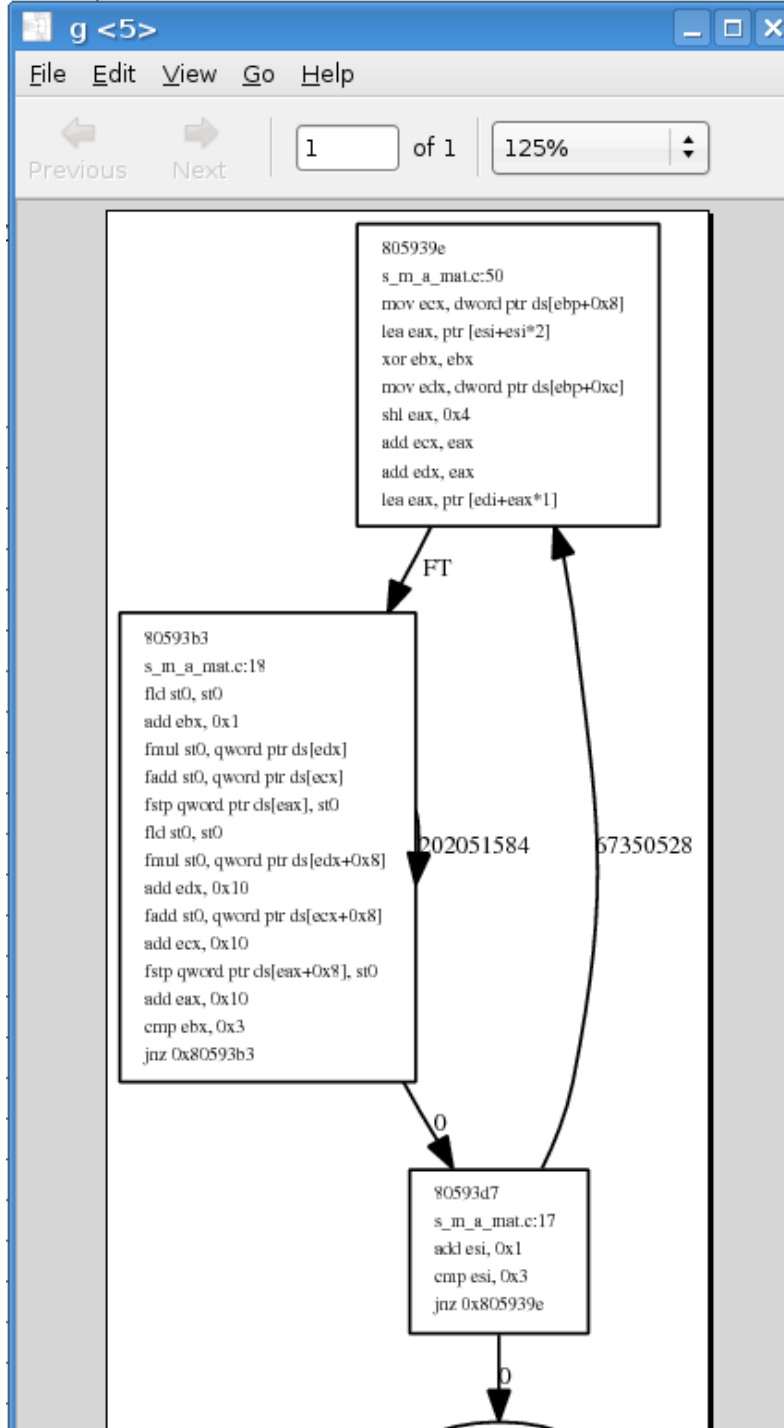
Or type one in:

Current Query: '^J'

## Matched Functions

	MAX	linux ia32 gnu 4.1.0 shared -O2 433.milc train/0 NORMALIZED	linux ia32 intel 9.1 shared -O2 433.milc train/0 NORMALIZED
<a href="#">\$dynamic-counts</a>	1B	1.000	0.423
<a href="#">scalar_mult_add_su3_matrix</a>	404M	1.000	0.333
<a href="#">su3_projector</a>	254M	1.000	0.333
<a href="#">mult_su3_nn</a>	206M	1.000	0.333
<a href="#">mult_su3_na</a>	201M	1.000	0.333
<a href="#">su3_adjoint</a>	74M	1.000	0.333
<a href="#">mult_su3_mat_vec</a>	63M	1.000	0.000
<a href="#">mult_adj_su3_mat_vec</a>	61M	1.000	0.000
<a href="#">start_gather_from_temp</a>	59M	1.000	1.000
<a href="#">scalar_mult_add_su3_vector</a>	39M	1.000	0.000
<a href="#">su3mat_copy</a>	28M	1.000	1.000

	MAX	linux ia32 gnu 4.1.0 shared -O2 433.milc train/0 scalar_mult_add_su3_matrix IPO: 1774190592 NORMALIZED <a href="#">Disassemble</a> <a href="#">Disassemble (dot)</a> <a href="#">Disassemble (ps)</a>	linux ia32 intel 9.1 shared -O2 433.milc train/0 scalar_mult_add_su3_matrix IPO: 1774190592 NORMALIZED <a href="#">Disassemble</a> <a href="#">Disassemble (dot)</a> <a href="#">Disassemble (ps)</a>
Dyn Total	5B	100.0	50.9
Stack Reads	437M	100.0	46.2
Stack Writes	134M	100.0	25.0
Memory Reads	1B	100.0	85.7
Memory Writes	740M	100.0	86.4
mem-read-var	0	0.0	0.0
mem-write-var	0	0.0	0.0
mem-atomic	0	0.0	0.0
iprel-read	0	0.0	0.0
iprel-write	0	0.0	0.0
CMOV*	0	0.0	0.0
ADD*	1B	100.0	6.7
SUB*	0	0.0	0.0
J*	404M	100.0	33.3
CALL	0	0.0	0.0
RET	33M	100.0	100.0
MUL*	0	0.0	0.0
DIV*	0	0.0	0.0

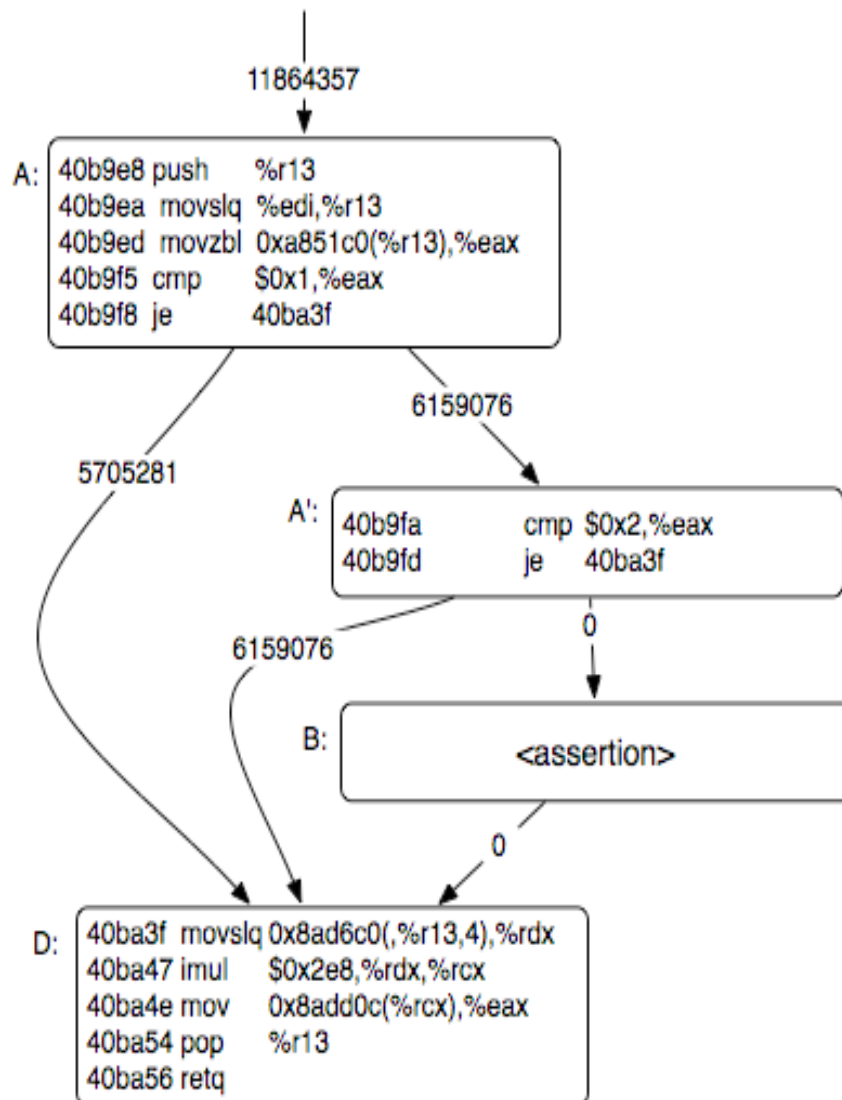


# Original Source

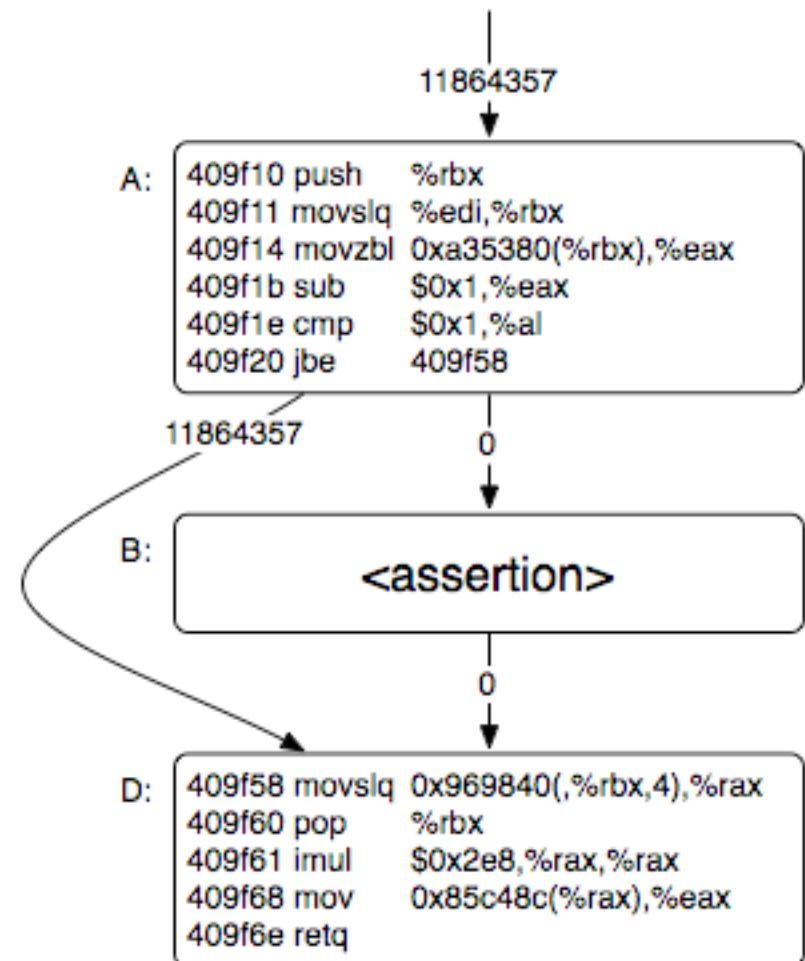
```
register int i,j;
for(i=0;i<3;i++) {
    for(j=0;j<3;j++) {
        c->e[i][j].real =
            a->e[i][j].real + s*b - e[i][j].real;
        c->e[i][j].imag =
            a->e[i][j].imag + s*b - e[i][j].imag;
    }
}
```

# Case Study: 445.gobmk countlib()

Intel



GCC: **800% Faster!**



# Case Study: 445.gobmk countlib()

```
/* Count the number of liberties of the string at pos. pos
   must not be empty. */
int
countlib(int str)
{
    ASSERT1(((board[str]) == WHITE || (board[str]) == BLACK),
            str);

    /* We already know the number of liberties. Just look it
       up. */
    return string[string_number[str]].liberties;
}
```

# Case Study: 445.namd Patch::zeroforces()

- Both loads are loop-invariant (%ecx does not change)
- GCC 4.1 hoists the loads above the loop resulting in **6912** loads versus **1.6M** from ICC
- GCC's code is **25%** faster

ICC 9.1 -O3 -mtune

```
head:
mov 0x74(%ecx),%esi
fstl (%eax,%esi,1)
fstl 0x8(%eax,%esi,1)
fstl 0x10(%eax,%esi,1)
mov 0x78(%ecx),%esi
fstl (%eax,%esi,1)
fstl 0x8(%eax,%esi,1)
fstl 0x10(%eax,%esi,1)
add $0x18,%eax
add $0x1,%edx
cmp (%ecx),%edx
jl head
```



# Case Study: 462.libquantum

IA-64 GCC 4.1.0 -O2

- For a simple, linear for loop, ICC inserts a speculative load that often fails (still don't fully understand why)

- Example of over-aggressive optimization

- GCC's version executes 60% less instructions and 46% less memory reads, 32.5% faster

```
// quantum_addscratch():  
for(i=0; i<reg->size; i++) {  
    l = reg->node[i].state<<bits;  
    reg->node[i].state = l;  
}
```

**HEAD:**

```
{ld8  r14=[r33];;  
nop.m 0x0  
shl  r14=r14,r32;;}  
{st8  [r33]=r14,16  
nop.i 0x0  
br.cloop.sptk.few HEAD;;}
```

# Case Study: 464.h264ref

## SetCoeffAndReconstruction8x8()

- Innermost loop of quadruply nested loop
- GCC 4.1.0 recomputes address calculations each iteration
- 93% less stack writes, 170% faster

### GCC 3.4.6 -O2

```
head:
mov  (%edx,%ebx,4),%eax
mov  %eax, (%ecx,%ebx,4)
inc  %ebx
cmp  $0x40,%ebx
jle  head
```

### GCC 4.1.0 -O2

```
head:
mov  0xffffffffac(%ebp),%edx
mov  (%edi,%edx,1),%eax
mov  0xffffffff9c(%ebp),%edx
mov  (%eax,%esi,1),%eax
mov  (%eax,%ebx,1),%eax
mov  %eax,0xffffffffb0(%ebp)
mov  (%edi,%edx,1),%eax
mov  0xffffffffb0(%ebp),%edx
mov  (%eax,%esi,1),%eax
mov  (%eax,%ebx,1),%eax
mov  (%eax,%ecx,1),%eax
mov  %eax, (%edx,%ecx,1)
add  $0x4,%ecx
cmp  $0x104,%ecx
jne  head
```

# Observations

- Finding performance bugs is easy!
  - “Big” anomalies take 1-2 hours of analysis
  - Smaller differences more abundant
- Compilers *still* do silly things
  - Direct jump to next instruction
  - Jump to return instruction
  - Spill all registers, then immediately refill

# Future Work

- Collect much more detailed profiles
  - Hardware perf data
  - Load-use distance
  - Stack/heap/text memory references
- Use binary matching to correlate profiles at finer grain (loop, bbl)
- Automate regression testing

# Questions?