15-745 Introduction

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CMU

Based in part on slides by Todd Mowry and Michael Voss

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Introduction

- Why study compilers?
- · Administriva
- Structure of a Compiler
- · Optimization Example

Reference: Muchnick 1.3-1.5

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Moore's Law





Moore's Law

Imagine: Computers that

 Imagining it is hard enough,
 achieving it requires a rethink of the entire tool chain.



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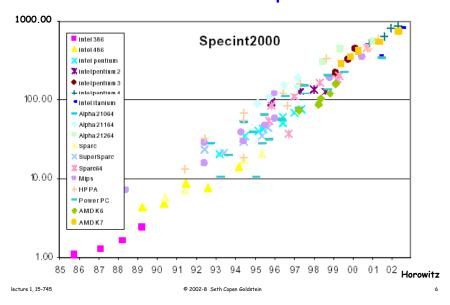
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What is Behind Moore's Law?

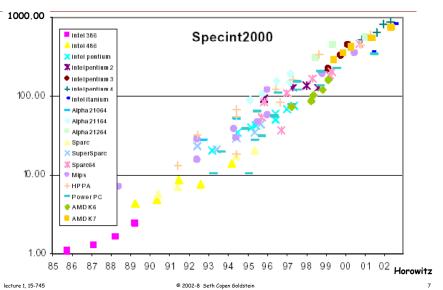
- A lot of hard work!
- Two most important tools:
 - Parallelism
 - · Bit-level
 - Pipeline
 - Function unit
 - · Multi-core
 - Locality

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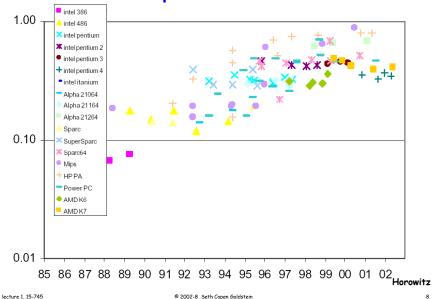
Performance: Ops/Sec



Performance: Ops/Clk * Clks/Sec

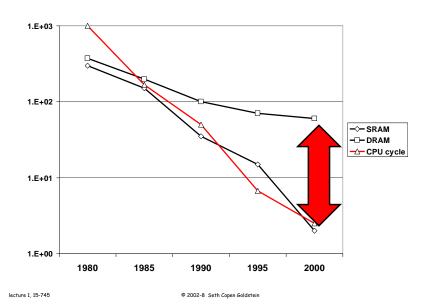


SpecInt/Mhz

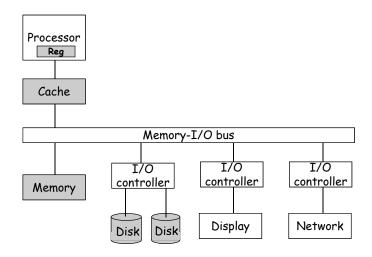


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Another View of Moore's Law

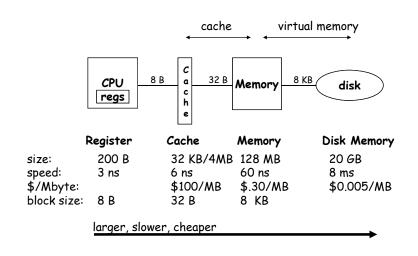


The Computer System



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The Memory Hierarchy



Compiler Writer's Job

- Improve locality
- Increase parallelism
- Tolerate latency
- Reduce power

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Why study compilers

- · They are really amazing
- Combines theory & practice
 - CS is about abstraction
 - · Primary abstraction: programming language
 - Compiler lowers PL to ISA (or further!)
 - Compiler is a big system
- Crucial for performance
 - especially for modern processors
 - practically part of the architecture
- I bet: Everyone will write a compiler

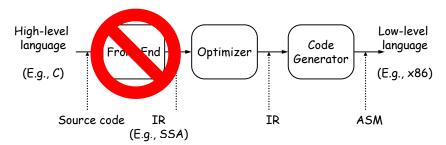
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Why study compilers

- · They are really amazing
- Combines theory & practice
 - CS is about abstraction
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 - · Compiler lowers PL to ISA (or further!)
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- Crucial for performance
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What this course is about



- Theory and practice of modern optimizing compilers
 - No lexing or parsing
 - · Focus on IR, back-end, optimizations
- Internals of today's (and tomorrow's) compilers
- Working with a real compiler

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Prerequisites

- · 211 & 213 or the equivalent
- Parts of 411 or the equivalent
 - Basic compiler data structures
 - Frames, calling conventions, def-use chains, etc.
 - Don't really care about front-end
- Proficient in C/C++ programming
- · Basic understanding of architecture

My Expectations

- You have the prerequisites
 - If not come see me asap
- 3 assignments + a project
- Class participation
 - THIS IS A MUST!
 - Read text/papers before class
 - Attendance is essentially mandatory

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Assignments

- Intro to LLVM/Liveness
- Dependence analysis
- Locality/Parallel transformations
- All labs and the final project will be done in a state-of-the-art research compiler: LLVM



Grading

Class participation ~20%

- Throughout the semester
- During paper presentations
- Project presentations

assignments ~20%

Project ~40%

Midterm ~20%

The Text

- No assigned text. There are some on reserve. Its really up to you.
- · Muchnick, Advanced Compiler Design & Impl., 1997
- · Allen, et.al., Optimizing Compilers for Modern Archs, 2001
- · Copper, et.al., Engineering a compiler, 2003
- Aho, et.al., Compilers: ..., 2006









· Papers will be assigned

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Before we get too bored

- · More admin at the end, but first ...
- What exactly is an optimizing compiler?
 - An optimizing compiler transforms a program into an equivalent, but "better" form.
 - What is equivalent?
 - What is better?

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Full Employment Theorem

- No such thing as "The optimizing compiler"
 - Why not?
- There is always a better optimizing compiler, but ...
 - Compiler must preserve correctness
 - On average improve X, where X is:
 - Performance
 - Power
 - Finish in your lifetime

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How might performance be improved?

 \sum cycles per instruction execution time = instructions

- Reduce the number of instructions
- · Replace "expensive" instructs with "cheap" ones
- Reduce memory cost
 - Improve locality
 - Reduce # of memory operations
- Increase parallelism

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Ingredients to a compiler opt

- Identify opportunity
 - Avail in many programs
 - Occurs in key areas (what are these?)
 - Amenable to "efficient" algorithm
- Formulate Problem
- Pick a Representation
- Develop an Analysis
 - Detect when legal
 - And desirable
- Implement Code Transformation
- Evaluate (and repeat!)

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Examples of Optimizations

- Machine Independent
 - Algebraic simplification
 - Constant propagation
 - Constant folding
 - Common Sub-expression elimination
 - Dead Code elimination
 - Loop Invariant code motion
 - Induction variable elimination
- Machine Dependent
 - Jump optimization
 - Reg allocation
 - Scheduling
 - Strength reduction
 - Loop permutations

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Really Powerful Opts we won't do

```
• How to optimize:
    Sumfrom1toN(int max) {
    sum = 0;
    for (i=1; i<=max; i++) sum+=i;
    return sum;
}</pre>
```

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Really Powerful Opts we won't do

```
 How to optimize:
```

```
Sumfrom1toN(int max) {
  sum = 0;
  for (i=1; i<=max; i++) sum+=i;
  return sum;
}</pre>
```

What we should, but won't do:

```
inline sumfrom1toN(int max) {
  return max > 0 ?
   ((max+max*max)>>1) : 0;
}
```

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Algebraic Simplifications

```
a^*1; \Rightarrow a
a/1; \Rightarrow a
a^*0; \Rightarrow 0
a^*0; \Rightarrow a
a^*0; \Rightarrow a
a^*0; \Rightarrow a
a^*0; \Rightarrow a
```

Use algebraic identities to simplify computations

Jump Optimizations

Simplify jump and branch instructions.

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Constant Folding

```
:
:
:
:
:
n = 8 ;
for (i = 0 ; i < 8 ; ++i) {
:
}
```

- The compiler evaluates an expression (at compile time) and inserts the result in the code.
- Can lead to further optimization opportunities;
 esp. constant propagation.

Constant Propagation

If the compiler can determine that the values of a and b are constants, then it can replace the variable uses with constant values.

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Common Subexpression Elimination (CSE)

```
a = c*d; a = c*d; \vdots \vdots d = (c*d + t) * u d = (a + t) * u
```

If the compiler can determine that:

- · an expression was previously computed
- and that the values of its variables have not changed since the previous computation,

Then, the compiler can use the previously computed value.

Strength Reduction

- On some processors, the cost of an addition is less than the cost of multiplication.
- The compiler can replace expensive multiplication instructions by less expensive ones.

```
c = lsh(b);
                         c = b + b:
 c = b * 2;
                                           move $2000, d0
 move $2000, d0
                        move $2000, d0
                                                    #1, d0
                             d0, d0
 muls #2, d0
                                           move d0, $3000
                         move d0, $3000
 move d0, $3000
 c = -1*b;
                         c = negative(b);
 move $2000, d0
                         move $2000, d0
 muls \#-1,d0
                                d0
                         neg
 move d0, $3000
                        move d0, $3000
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```

Dead Code Elimination

```
debug = False;
    :
    :
if (debug) {
    :
    :
}
a = f(b);
```

If the compiler can determine that code will never be executed or that the result of a computation will never be used, then it can eliminate the code or the computation.

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Loop Invariant Code Motion

```
for (i=0; i<100; ++i) {
  for (j=0; j<100; ++j) {
    for (k=0; k<100; ++k)
    {
       a[i][j][k] = i*j*k;
    }
  }
}</pre>
```

```
for (i=0; i<100 ; ++i) {
  for (j=0; j<100 ; ++j) {
    t1 = a[i][j];
    t2 = i*j;
  for (k=0 ; k<100 ; ++k)
    {
     t1[k] = t2*k;
    }
  }
}</pre>
```

- Loop invariant: expression evaluates to the same value each iteration of the loop.
- · Code motion: move loop invariant outside loop.
- Very important because inner-most loop executes most frequently.

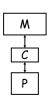
Loop Invariant Code Motion

```
int *a;
int *a;
                                 int n;
int n;
                                 scanf("%d", &n);
scanf("%d", &n);
                                 f = q/p;
for (i=0; i<n; ++i) {
                                 for (i=0; i<n; ++i) {
 for (j=0; j<n; ++j) {
                                  for (j=0; j<n; ++j) {
  for (k=0 ; k< n ; ++k)
                                   t1 = a[i][j];
                                   t2 = i*j;
    f = q/p;
                                   for (k=0 ; k< n ; ++k)
    a[i][j][k] = f*i*j*k;
                                      t1[k] = f*t2*k;
                                     Oooops!!!!!
```

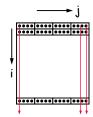
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Cache Optimizations

```
for (j=0; j<n; ++j) {
   for (i=0; i<n; ++i) {
      x += a[i][j];
   }
}</pre>
```



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Loop permutation changes the order of the loops to improve the spatial locality of a program.

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Cache Optimizations

Loop permutation changes the order of the loops to improve the spatial locality of a program.

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Example

A program that sorts 4-byte elements in an nelement array of integers A[1..n] using bubblesort.

```
for (i=n-1; i >= 1; --i) {
    for (j = 1; j <= i; ++j) {
        if (A[j] > A[j+1]) {
            temp = A[j];
            A[j] = A[j+1];
            A[j+1] = temp;
        }
    }
}
// i and j are not used later
```

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A Generated IR

```
t10 = j+1
       S5: if i < 1 goto Exit
                                            t11 = t10-1
                                                               A\Gamma i+11
                                            t12 = 4*t11
       S4: if j > i goto S2
                                            t13 = [A+t12]
                                           t14 = j-1
                                            [A+t15] = t13 -A[j]=A[j+1]
            t3 = [A+t2]
A[j+1]^{-1}
                                           t17 = t16-1
            t6 = 4*t5
                                           t18 = 4*t17
            t7 = [A+t6]
                                            [A+t18] = temp_A[j+1] = temp_A
            if t3 <= t7 goto S3
                                      s3: j = j+1
temp= ₹
            t9 = 4*t8
                                           goto S4
            temp = [A+t9]
                                      s2: i = i-1
                                           goto S5
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```

Optimizations I - Algebraic Simplifications

```
t10 = i+1
    i = n-1
S5: if i < 1 goto Exit
                                         t+1 = t10-1
                        t12 = 4*4
                                         t12 = 4*t11
    j = 1
                                         t13 = [A+t12]
S4: if j > i goto S2
    t1 = j-1
    t2 = 4*t1
                                         t14 = i-1
                        t18 = 4*j
                                         t15 = 4*t14
    t3 = [A+t2]
                                         [A+t15] = t13
    t4 = i+1
                                        t16 = j+1
    t5 = t4-1
                                         t17 = t16-1
    t6 = 4*t5
                         t6 = 4*j
    t7 = [A+t6]
                                        t18 = 4*t17
    if t3 <= t7 goto S3
                                        [A+t18] =
    t8 = j-1
                                    temp
    t9 = 4*t8
                                    53: j = j+1
                                        goto S4
    temp = [A+t9]
                                    s2: i = i-1
                                         goto S5
                                    Exit:
```

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Optimizations II - CSE

```
t12 = 4*i
    i = n-1
S5: if i < 1 goto Exit t12 = t6
                                        t13 = [A+t12]
                                        t14 = t1
    j = 1
S4: if j > i goto S2
                                        t15 = 4*t14
                                        [A+t15] = t13
    t1 = j-1
                       t18 = t6
    t2 = 4*t1
                                        t18 = 4*j
                                        [A+t18] = temp
    t3 = [A+t2]
    t6 = 4*i
                                   s3: j = j+1
    t7 = [A+t6]
                                        goto S4
                                   S2: i = i-1
    if t3 <= t7 goto S3
    t8 = t1
                                        goto S5
    t9 = 4*t8
                                   Exit:
    temp = [A+t9]
```

Optimizations II - CSE

```
t12 = 4*i
    i = n-1
S5: if i < 1 goto Exit
                                        t13 = [A+t12]
     j = 1
                                        t14 = j-1
                                        t15 = 4*t14
S4: if j > i goto S2
                                        [A+t15] = t13
    t1 = j-1
    t2 = 4*t1
                                        t18 = 4*i
    t3 = [A+t2]
                                        [A+t18] = temp
                                   53: i = i+1
     t6 = 4*j
    t7 = [A+t6]
                                        goto $4
                                   s2: i = i-1
     if t3 <= t7 goto S3
    t8 = j-1
                         t8 = t1
                                        goto S5
     t9 = 4*t8
                                   Exit:
     temp = [A+t9]
```

Optimizations III - Copy Propagation

```
t13 = [A+t6]
                                        t12 = t6
     i = n-1
S5: if i < 1 goto Exit
                                        t13 = [A+t12]
                                         t14 = t1
     j = 1
S4: if j > i goto S2 t15 = 4*t1
                                        t15 = 4*t14
     t1 = j-1
                                         [A+t15] = t13
     t2 = 4*t1
                                        t18 = t6
                                         [A+t18] = temp
     t3 = [A+t2]
                    [A+t6] = temp
     t6 = 4*i
                                    s3: j = j+1
     t7 = [A+t6]
                                        goto S4
                                    s2: i = i-1
     if t3 <= t7 goto S3
    t8 = t1
                                        goto S5
                        t9 = 4*t1
    t9 = 4*t8
                                    Exit
     temp = [A+t9]
```

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Optimizations IV - CSE (2)

```
t13 = t7
                                        t13 = [A+t6]
    i = n-1
S5: if i < 1 goto Exit
                                        t15 = 4*t1
                                        [A+t15] = t13
    j = 1
S4: if j > i goto S2
                                        [A+t6] = temp
                       t15 = t2
                                   s3: j = j+1
    t1 = j-1
    t2 = 4*t1
                                        goto $4
                                   s2: i = i-1
    t3 = [A+t2]
    t6 = 4*i
                                        goto S5
    t7 = [A+t6]
                                   Exit:
                        t9 = t2
    t9 = 4*t1
    temp = [A+t9]
```

Optimizations V - Copy Propagation (2)

```
t13 = t7
    i = n-1
S5: if i < 1 goto Exit
                                        t15 = t2
                        [A+t21 = t7]
                                         [A+t15] = t13
     j = 1
S4: if j > i goto S2
                                         [A+t6] = temp
    t1 = j-1
    t2 = 4*t1
                                    s3: i = i+1
    t3 = [A+t2]
                                        goto S4
                                    s2: i = i-1
    t6 = 4*j
    t7 = [A+t6]
                                        goto S5
                                   Exit:
     if t3 <= t7 goto S3
    t9 = t2
                           temp = [A+t2]
    temp = [A+t9]
```

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Optimization VI - CSE (3)

```
i = n-1
                                        [A+t21 = t7]
S5: if i < 1 goto Exit
                                        [A+t6] = temp
    j = 1
S4: if j > i goto S2
                                   s3: j = j+1
    t1 = j-1
                                        goto S4
    t2 = 4*t1
                                   S2: i = i-1
                                        goto S5
    t3 = [A+t2]
    t6 = 4*i
                                   Exit:
                        temp = t3
    t7 = [A+t6]
    temp = [A+t2]
```

Optimization VII - Copy Propagation (3)

```
i = n-1
                                         [A+t21 = t7]
S5: if i < 1 goto Exit
                                         [A+t6] = temp
     j = 1
S4: if j > i goto S^{2}[A+t6] = [t3] | S3: j = j+1
                                         goto S4
     t1 = j-1
     t2 = 4*t1
                                    S2: i = i-1
                                         goto S5
     t3 = [A+t2]
     t6 = 4*i
                                    Exit:
     t7 = [A+t6]
     if t3 <= t7 goto S3
    temp = [t3]
```

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Optimizations VIII - IVE & Strength Reduction

```
i = n-1
S5: if i < 1 goto Exit
    i = 1
S4: if j > i goto S2
    t1 = j-1
    t2 = 4*t1
    t3 = [A+t2]
    t6 = 4*j
    t7 = [A+t6]
    if t3 <= t7 goto S3
    [A+t2] = t7
    [A+t6] = t3
s3: j = j+1
   -goto S4
s2: i = i-1
  goto S5
Exit:
```

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Optimizations VIII - IVE & Strength Reduction

```
i = n-1
                                     i = n-1
S5: if i < 1 goto Exit
                                 S5: if i < 1 goto Exit
    j = 1
                                     t2 = 0
S4: if j > i goto S2
                                     t6 = 4
                                 54: t19 = 4*i
    t1 = j-1
                                     if t6 > t19 goto S2
    t2 = 4*t1
    t3 = [A+t2]
                                     t3 = [A+t2]
                 Loop Invariant
    t6 = 4*j
                  Code Motion...
    t7 = [A+t6]
                                     t7 = [A+t6]
    if t3 <= t7 goto S3
                                     if t3 <= t7 goto S3
                                     [A+t2] = t7
    [A+t2] = t7
    [A+t6] = t3
                                     [A+t6] = t3
                                 s3: t2 = t2+4
s3: j = j+1
    goto $4
                                     t6 = t6+4
s2: i = i-1
                                     goto S4
    goto S5
                                 s2: i = i-1
Exit:
                                     goto S5
                                 Exit:
```

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Done?

```
i = n-1
                                        t19 = i*4
           S5: if < 1 goto Exit
                                           - t19 < 4
                t6 = 4
           54: \pm 19 = 4*i
                if t6 > t19 goto S2
                t3 = [A+t2]
[A-4+t6]
                t7 = [A+t6]
                if t3 <= t7 goto S3
                [A+t21 = t7]
                [A+t61 = t3]
           53: \pm 2 = \pm 2 + 4
                t6 = t6+4
                goto $4
                                        -t19 = t19-4
           S2: i = i + 1
                goto S5
           Exit:
```

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Done?

```
i = n-1
    t19 = i*4
S5: if t19 < 4 goto Exit
    t6 = 4
S4: if t6 > t19 goto S2
    t3 = [A+t6-4]
    t7 = [A+t6]
    if t3 <= t7 goto S3
    [A+t6-4] = t7
    [A+t6] = t3
s3: t6 = t6+4
    goto S4
                      Eliminate mult,
s2: t19 = t19 - 4
                Use double load (if aligned?)
    goto S5
                          Unroll?
Exit:
                       Eliminate imp
```

Done For Now.

```
i = n-1
t19 = i << 2
if t19 < 4 goto Exit

S5: t6 = 4
    if t6 > t19 goto S2

S4: t3 = [A+t6-4]
    t7 = [A+t6]
    if t3 <= t7 goto S3
    [A+t6-4] = t7
    [A+t6] = t3

S3: t6 = t6+4
    if t6 <= t19 goto s4

S2: t19 = t19 - 4
    if t19 >= 4 goto s5

Exit:
```

Inner loop: 7 instructions

4 mem ops

2 branches

1 addition

Original inner loop: 25 instructi

6 mem ops

3 branches

10 addition

6 multiplication

Course Schedule

 www.cs.cmu.edu/afs/cs/academic/class/ 15745-s08/www/

The Web site is a vital resource

(And, of course us too.)

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Course Staff

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First Assignment

- Install llvm on your favorite machine
- Get familiar with llvm tools, IR, structure
- · Lots of docs at www.llvm.org
- First part of assignment 1 will be posted later today.

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