V22.0474-001 Software Engineering
Spring 2007
Lecture 21: Code Optimization II

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Outline

- Project Status Check
- Code Tuning: Logic
- Code Tuning: Loops
- Code Tuning: Data Transformations
- Code Tuning: Other Techniques

Sources for today’s lecture:

Project Status Check

Upcoming assignments

- **April 11**: Code for testing (hw8) is due.
- **April 18**: Testing report (hw9) is due.
- **April 23**: Testing presentations will take place in class:
  - Send me the slides by 10am on April 23;
  - As before, each team has 20 minutes;
  - The presentation should be given by someone new;
  - Discuss unit, integration, and system/user-testing on your own project.
- **April 25**: Testing report for other team (hw10) is due.
- **April 30**: Final project presentations
  - Each team will have 20 minutes to present their project;
  - Final presentations should present the final product as well as discuss what was accomplished and learned during the project as a whole.
- **May 3**: Spring Showcase
  - Demo your project for anyone who wants to see.
  - Refreshments will be served!
In this lecture, we will discuss specific code-tuning techniques.

The warnings and guidelines about performance tuning we discussed last time still apply.

In particular, code-tuning usually means trading off readability and maintainability for speed.

The effectiveness of a specific technique will depend on your development environment.

Thus, consider this a list of things to try, but you still need to measure performance before and after.
Stop testing when you know the answer

*Which is faster?*

```java
if ((5 < x) && (x < 10)) {
    ...
}

if (5 < x) {
    if (x < 10) {
        ...
    }
}
```
Code Tuning: Logic

Stop testing when you know the answer

*Which is faster?*

```java
if ((5 < x) && (x < 10)) {
    ...
}
```

```java
if (5 < x) {
    if (x < 10) {
        ...
    }
}
```

In C, C++, and Java, there is no difference because these languages have *short-circuit* evaluation. In other languages, however, the second piece of code may be faster.
Code Tuning: Logic

How can the same principle be applied to the following code?

```java
negativeInputFound = false;
for (i = 0; i < count; i++) {
    if (input[i] < 0) {
        negativeInputFound = true;
    }
}
```

Once a negative value has been found, it is unnecessary to continue the for loop. Some possible ways to implement this include:

- Use `break` or `goto` to end the loop when `input[i] < 0`.
- Check for `negativeInputFound` as part of the loop-terminating condition.
- Use a sentinel (more on this later).
Code Tuning: Logic

*How can the same principle be applied to the following code?*

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 for (i = 0; i < count; i++) {
     if (input[i] < 0) {
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 }

Once a negative value has been found, it is unnecessary to continue the for loop. Some possible ways to implement this include:

- Use `break` or `goto` to end the loop when `input[i] < 0`.
- Check for `negativeInputFound` as part of the loop terminating condition.
- Use a sentinel (more on this later).
How could the following code be made faster?

```c
if (c == '+' || c == '=')
    ProcessMathSymbol(c);
else if (c >= '0' && c <= '9')
    ProcessDigit(c);
else if (c == ',' || c == '.' || c == '!' || c == '?')
    ProcessPunctuation(c);
else if (c == ' ')
    ProcessSpace(c);
else if (((c >= 'A' && c <= 'Z') || (c >= 'a' && c <= 'z'))
    ProcessAlpha(c);
```

Order Tests by Frequency
By reordering the tests to put the common cases first, we can avoid many unnecessary tests.

Compare Performance of Similar Logic Structures
We could also rewrite the code using `switch` and `case`. Would this be faster?
It's unclear. The only reliable way to find out is to measure it.
How could the following code be made faster?

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    ProcessPunctuation(c);
else if (c == ' ')
    ProcessSpace(c);
else if ((c >= 'A' && c <= 'Z') || (c >= 'a' && c <= 'z'))
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Code Tuning: Logic

Suppose you wanted to categorize an object into one of four categories (0, 1, 2, 3) based on which groups A, B, or C it belongs to as follows.

*How would you do it?*
Code Tuning: Logic

One solution:

```java
if ((isA(x) && !isC(x)) || (isA(x) && isB(x) && isC(x))) {
    category = 1;
} else if ((isB(x) && !isA(x)) || (isA(x) && isC(x) && !isB(x))) {
    category = 2;
} else if (isC(x) && !isA(x) && !isB(x)) {
    category = 3;
} else {
    category = 0;
}

How can this be improved?
```
Code Tuning: Logic

Substitue Table Lookups for Complicated Expressions

Here is a faster solution:

```java
// define categoryTable
static int categoryTable[2][2][2] = {
    // !b!c !bc b!c bc
    0, 3, 2, 2, // !a
    1, 2, 1, 1 // a
};

... category = categoryTable[isA(x)][isB(x)][isC(x)];
```

A lookup table, if well-documented, is faster and easier to maintain than a complicated chain of if-then-else.
Code Tuning: Logic

How can you apply this principle in programming?
Use Lazy Evaluation

In programming, laziness means waiting to do work until you know it will be needed.

For example, suppose you have a table of 5000 values that might be used, but only a few hundred are actually used in any run of the program. Rather than pre-computing all 5000 values, you may want to wait and compute only the values you need when you need them.

Note that if most of the 5000 values are used, or if values are used many many times, it may be faster to pre-compute everything.

As usual, you have to know your application and measure.
How can this code be made faster?

```c
for (i = 0; i < count; i++) {
    if (sumType == SUMTYPE_NET)
        netSum += amount[i];
    else
        grossSum += amount[i];
}
```
Code Tuning: Loops

Unswitching

*How can this code be made faster?*

```c
for (i = 0; i < count; i++) {
    if (sumType == SUMTYPE_NET)
        netSum += amount[i];
    else
        grossSum += amount[i];
}
```

The test `sumType == SUMTYPE_NET` is repeated on each iteration. The loop can be rewritten as follows:
Code Tuning: Loops

Unswitching

How can this code be made faster?

for (i = 0; i < count; i++) {
  if (sumType == SUMTYPE_NET)
    netSum += amount[i];
  else
    grossSum += amount[i];
}

The test sumType == SUMTYPE_NET is repeated on each iteration. The loop can be rewritten as follows:

if (sumType == SUMTYPE_NET) {
  for (i = 0; i < count; i++)
    netSum += amount[i];
}
else {
  for (i = 0; i < count; i++)
    grossSum += amount[i];
}
Code Tuning: Loops

Jamming or “Loop Fusion”

How would you speed up the following code?

```plaintext
for (i=0; i < employeeCount; i++) {
    employeeName[i] = "";
}
for (i=0; i < employeeCount; i++) {
    employeeEarnings[i] = 0;
}
```
Code Tuning: Loops

Jamming or “Loop Fusion”

How would you speed up the following code?

```c
for (i=0; i < employeecount; i++) {
    employeeName[i] = "";
}
for (i=0; i < employeecount; i++) {
    employeeEarnings[i] = 0;
}
```

The two loops can be “fused” as follows:

```c
for (i=0; i < employeecount; i++) {
    employeeName[i] = "";
    employeeEarnings[i] = 0;
}
```

What do you have to worry about before doing loop fusion?

If there are dependencies between the two loops, you have to check that the fused loop still does the right thing. Also, note that many compilers perform this optimization automatically.
**Code Tuning: Loops**

**Jamming or “Loop Fusion”**

*How would you speed up the following code?*

```c
for (i=0; i < employeecount; i++) {
    employeeName[i] = "";
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for (i=0; i < employeecount; i++) {
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for (i=0; i < employeecount; i++) {
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```

*What do you have to worry about before doing loop fusion?*

If there are dependencies between the two loops, you have to check that the fused loop still does the right thing.

Also, note that many compilers perform this optimization automatically.
Unrolling

Recall that last time we gave an example of a loop that iterated 10 times. The “unrolled” code was 10 times larger but also a bit faster. This principle can be applied to any loop. Consider the following:

```c
i = 0;
while (i < count) {
    a[i] = i;
    i++;
}
```

Here is the loop after one unrolling:

```c
i = 0;
while (i < count - 1) {
    a[i] = i;
    a[i+1] = i+1;
    i += 2;
}
if (i == count) {
    a[count-1] = count-1;
}
```
Code Tuning: Loops

This technique can be extended. Loops can be unrolled *twice, three times*, etc. Additional unrolls *complicate* the code significantly for *decreasing* performance gains.

As with loop fusion, loop unrolling is done *automatically* by many compilers.
Code Tuning: Loops

Minimizing the Work Inside Loops

*How could you make this code faster?*

```c
for (i = 0; i < rateCount; i++) {
    netRate[i] = baseRate[i] * rates->discounts->factors->net;
}
```
Code Tuning: Loops

Minimizing the Work Inside Loops

*How could you make this code faster?*

```c
for (i = 0; i < rateCount; i++) {
    netRate[i] = baseRate[i] * rates->discounts->factors->net;
}
```

We can move the complicated expression outside the loop. In this case, the result improves both readability and (in many cases) performance.

```c
quantityDiscount = rates->discounts->factors->net;
for (i = 0; i < rateCount; i++) {
    netRate[i] = baseRate[i] * quantityDiscount;
}
```
Code Tuning: Loops

Sentinel Values

Consider the following loop:

```java
found = false;
i = 0;
while (!found && (i < count)) {
    if (item[i] == testValue) {
        found = true;
    }
    else {
        i++;
    }
}
```

if (found) {
    ...
}

How could you reduce the number of conditions checked for each loop?
Code Tuning: Loops

By using a sentinel, we can combine all three tests into one:

```java
// Make sure there is space for at least count+1 objects
item[count] = testValue;

i = 0;
while (item[i] != testValue) {
    i++;
}

// Check if item was really found
if (i < count) {
    ...
}
```
Code Tuning: Loops

By using a *sentinel*, we can combine all three tests into one:

```plaintext
// Make sure there is space for at least count+1 objects
item[count] = testValue;

i = 0;
while (item[i] != testValue) {
    i++;
}

// Check if item was really found
if (i < count) {
    ...
}
```

Sentinels can be applied to nearly any situation in which you use linear search.

Of course, if you can avoid linear search, that’s even better...
Code Tuning: Loops

Putting the Busiest Loop on the Inside

Which is faster?

```java
for (row = 0; row < 100; row++) {
    for (column = 0; column < 5; column++) {
        sum += table[row][column];
    }
}
```

or

```java
for (column = 0; column < 5; column++) {
    for (row = 0; row < 100; row++) {
        sum += table[row][column];
    }
}
```
Code Tuning: Loops

Putting the Busiest Loop on the Inside

Which is faster?

```java
for (row = 0; row < 100; row++) {
    for (column = 0; column < 5; column++) {
        sum += table[row][column];
    }
}
```

or

```java
for (column = 0; column < 5; column++) {
    for (row = 0; row < 100; row++) {
        sum += table[row][column];
    }
}
```

Total loops executed: 600 in first case, 505 in second case.
Putting the Busiest Loop on the Inside

Which is faster?

```java
for (row = 0; row < 100; row++) {
    for (column = 0; column < 5; column++) {
        sum += table[row][column];
    }
}
```

or

```java
for (column = 0; column < 5; column++) {
    for (row = 0; row < 100; row++) {
        sum += table[row][column];
    }
}
```

Total loops executed: 600 in first case, 505 in second case.

But what about cache performance?
Code Tuning: Loops

Putting the Busiest Loop on the Inside

Which is faster?

```java
for (row = 0; row < 100; row++) {
    for (column = 0; column < 5; column++) {
        sum += table[row][column];
    }
}
```

or

```java
for (column = 0; column < 5; column++) {
    for (row = 0; row < 100; row++) {
        sum += table[row][column];
    }
}
```

Total loops executed: 600 in first case, 505 in second case.

But what about cache performance?

It’s hard to say which is faster. You would have to measure.
Code Tuning: Loops

Strength Reduction

Suppose you know that multiplication is much more expensive than addition. How could you rewrite this loop?

```java
for (i=0; i < saleCount; i++) {
    commission[i] = (i+1) * revenue * baseCommission * discount;
}
```
**Code Tuning: Loops**

**Strength Reduction**

Suppose you know that multiplication is much more expensive than addition. How could you rewrite this loop?

```java
for (i=0; i < saleCount; i++) {
    commission[i] = (i+1) * revenue * baseCommission * discount;
}
```

You can replace multiplication with addition as follows:

```java
incrementalCommission = revenue * baseCommission * discount;
cumulativeCommission = incrementalCommission;
for (i=0; i < saleCount; i++) {
    commission[i] = cumulativeCommission;
    cumulativeCommission += incrementalCommission;
}
```
Code Tuning: Data Transformations

Use Integers Rather Than Floating-Point Numbers

Integer addition and multiplication tend to be faster than floating point. Even changing a loop index from floating point to integer can save significant time.

Use the Fewest Array Dimensions Possible

If you can rewrite a multi-dimensional array as a one-dimensional array, it may save some time (at the expense of readability).

Minimize Array References

Every time you access an array, you have to do some pointer arithmetic and a dereference. If you can avoid it, this may speed things up. For example, you could store a commonly used array value in a temporary variable.
Code Tuning: Data Transformations

Use Supplementary Indexes

- **String-Length Index**
  Instead of calling `strlen` every time you want to compute the length of a `char*`, store the length as an extra variable with the `char*`. The `std::string` class does this for you. You can apply this principle to other similar situations.

- **Independent, Parallel Index Structure**
  Suppose you have big data structures and each one is identified by a unique integer id. If you are searching or manipulating the data structures, it may be easier to manipulate the indexes instead: Create an auxiliary data structure containing just the index and a pointer to the big data structure and manipulate that instead. This is a standard database technique.
Code Tuning: Data Transformations

Use Caching

The idea behind caching is to save the result of common expensive computations so you don’t have to compute them again.

For example, suppose you are computing the height of a binary tree:

class Tree { 
private:
    Tree* left;
    Tree* right;
public:
    ... 
    int height(Tree* t);
};

int Tree::height(Tree* t) 
{
    if (t->isLeaf()) return 1;
    else return 1+max(t->left()->height(),t->right()->height());
}
If we know there will be many calls to `height`, how can we speed up this routine?
If we know there will be many calls to `height`, how can we speed up this routine?

Here's one possible version, using caching:

```cpp
class Tree {
    ...
    int savedHeight;

public:
    Tree(Tree* l, Tree *r) : ... savedHeight(-1) {} 
    ...
};

int Tree::height(Tree* t)
{
    if (savedHeight == -1) {
        if (t->isLeaf()) savedHeight = 1;
        else savedHeight =
            1 + max(t->left()->height(), t->right()->height());
    }
    return savedHeight;
}
```
Code Tuning: Other Techniques

- Exploit algebraic identities
- Precompute values that are known at compile time
- Be wary of system libraries
- Use inlining
- Recode in a low-level language