

the recursion-tree method

solving recurrences

expanding the
recurrence into a tree
summing the cost at
each level
applying the
substitution method

another example

using a recursion
tree

1 solving recurrences

expanding the recurrence into a tree
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2 another example

using a recursion tree

MCS 360 Lecture 39
Introduction to Data Structures
Jan Verschelde, 22 November 2010

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solving recurrences

The substitution method for solving recurrences consists of two steps:

- 1 Guess the form of the solution.
- 2 Use mathematical induction to find constants in the form and show that the solution works.

In the previous lecture, the focus was on step 2.

Today we introduce the recursion-tree method to generate a guess for the form of the solution to the recurrence.

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tree

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using a recursion tree

an example

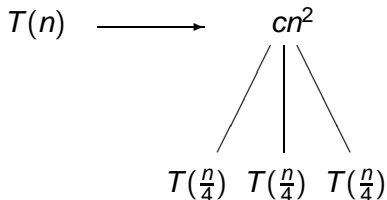
solving
recurrencesexpanding the
recurrence into a tree
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each level
applying the
substitution methodanother
exampleusing a recursion
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Consider the recurrence relation

$$T(n) = 3T(n/4) + cn^2 \quad \text{for some constant } c.$$

We assume that n is an exact power of 4.

In the recursion-tree method we expand $T(n)$ into a tree:



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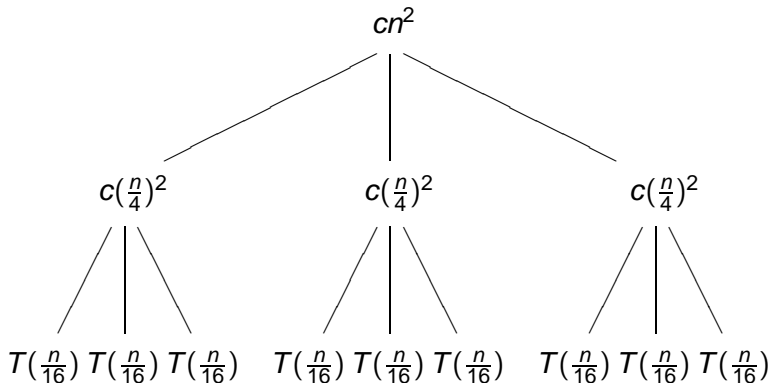
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recurrence into a tree
summing the cost at
each level
applying the
substitution method

another
example

using a recursion
tree

we expand $T(\frac{n}{4})$

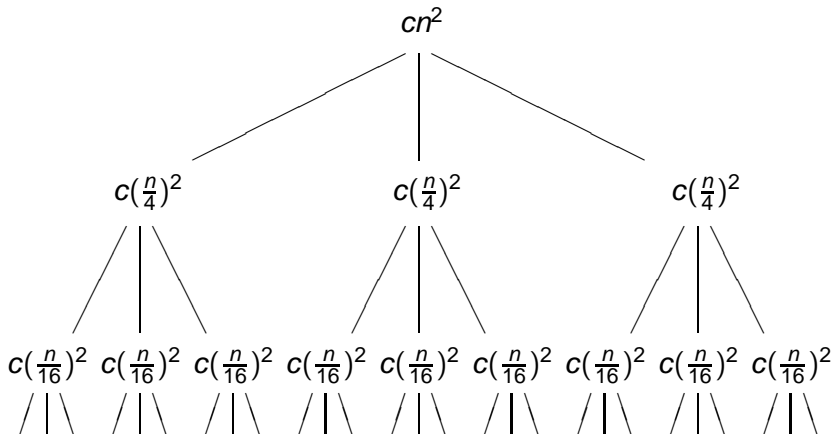
Applying $T(n) = 3T(n/4) + cn^2$ to $T(n/4)$ leads to
 $T(n/4) = 3T(n/16) + c(n/4)^2$, expanding the leaves:



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we expand $T(\frac{n}{16})$ solving
recurrencesexpanding the
recurrence into a treesumming the cost at
each levelapplying the
substitution methodanother
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tree

Applying $T(n) = 3T(n/4) + cn^2$ to $T(n/16)$ leads to
 $T(n/16) = 3T(n/64) + c(n/16)^2$, expanding the leaves:



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**summing the cost at
each level**

applying the
substitution method

another example

using a recursion
tree

1 solving recurrences

expanding the recurrence into a tree

summing the cost at each level

applying the substitution method

2 another example

using a recursion tree

solving
recurrences

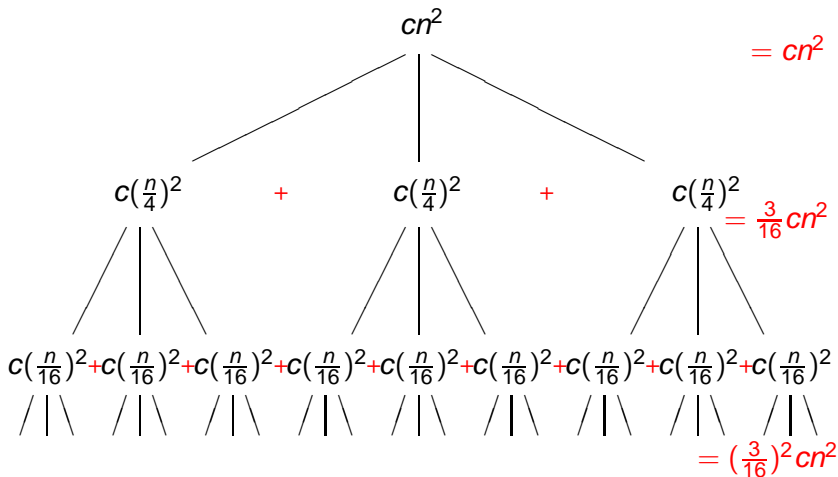
expanding the
recurrence into a tree

summing the cost at each level

applying the
substitution method

another
example

using a recursion
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$$= cn^2$$


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adding up the costs

solving
recurrencesexpanding the
recurrence into a treesumming the cost at
each levelapplying the
substitution methodanother
exampleusing a recursion
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$$\begin{aligned}
 T(n) &= cn^2 + \frac{3}{16}cn^2 + \left(\frac{3}{16}\right)^2 cn^2 + \dots \\
 &= cn^2 \left(1 + \frac{3}{16} + \left(\frac{3}{16}\right)^2 + \dots \right)
 \end{aligned}$$

The \dots disappear if $n = 16$,
or the tree has depth at least 2 if $n \geq 16 = 4^2$.

For $n = 4^k$, $k = \log_4(n)$, we have:

$$T(n) = cn^2 \sum_{i=0}^{\log_4(n)} \left(\frac{3}{16}\right)^i.$$

geometric series

solving
recurrencesexpanding the
recurrence into a treesumming the cost at
each levelapplying the
substitution methodanother
exampleusing a recursion
tree

Consider a finite sum first:

$$S_n = 1 + r + r^2 + \dots + r^n = \sum_{i=0}^n r^i.$$

To find an explicit form of the solution we do

$$\begin{array}{rcl}
 rS_n & = & r + r^2 + \dots + r^n + r^{n+1} \\
 -S_n & = & 1 + r + r^2 + \dots + r^n \\
 \hline
 (r-1)S_n & = & -1 + r^{n+1}
 \end{array}$$

So the explicit sum is

$$S_n = \frac{r^{n+1} - 1}{r - 1}.$$

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applying the geometric sum

solving
recurrencesexpanding the
recurrence into a treesumming the cost at
each levelapplying the
substitution methodanother
exampleusing a recursion
tree

Applying

$$S_n = \sum_{i=0}^n r^i = \frac{r^{n+1} - 1}{r - 1}$$

to

$$T(n) = cn^2 \sum_{i=0}^{\log_4(n)} \left(\frac{3}{16}\right)^i$$

with $r = \frac{3}{16}$ leads to

$$T(n) = cn^2 \frac{\left(\frac{3}{16}\right)^{\log_4(n)+1} - 1}{\frac{3}{16} - 1}.$$

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recurrencesexpanding the
recurrence into a treesumming the cost at
each levelapplying the
substitution methodanother
exampleusing a recursion
tree

polishing the result

Instead of $T(n) \leq dn^2$ for some constant d , we have

$$T(n) = cn^2 \frac{\left(\frac{3}{16}\right)^{\log_4(n)+1} - 1}{\frac{3}{16} - 1}.$$

Recall

$$T(n) = cn^2 \sum_{i=0}^{\log_4(n)} \left(\frac{3}{16}\right)^i.$$

To remove the $\log_4(n)$ factor, we consider

$$\begin{aligned} T(n) &\leq cn^2 \sum_{i=0}^{\infty} \left(\frac{3}{16}\right)^i \\ &= cn^2 \frac{-1}{\frac{3}{16} - 1} \leq dn^2, \text{ for some constant } d. \end{aligned}$$

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recurrencesexpanding the
recurrence into a treesumming the cost at
each levelapplying the
substitution methodanother
exampleusing a recursion
tree

verifying the guess

Let us see if $T(n) \leq dn^2$ is good for $T(n) = 3T(n/4) + cn^2$.

Applying the substitution method:

$$\begin{aligned}
 T(n) &= 3T(n/4) + cn^2 \\
 &\leq 3d \left(\frac{n}{4}\right)^2 + cn^2 \\
 &= \left(\frac{3}{16}d + c\right) n^2 \\
 &= \frac{3}{16} \left(d + \frac{16}{3}c\right) n^2 \\
 &\leq \frac{3}{16} (2d) n^2, \quad \text{if } d \geq \frac{16}{3}c \\
 &\leq dn^2
 \end{aligned}$$

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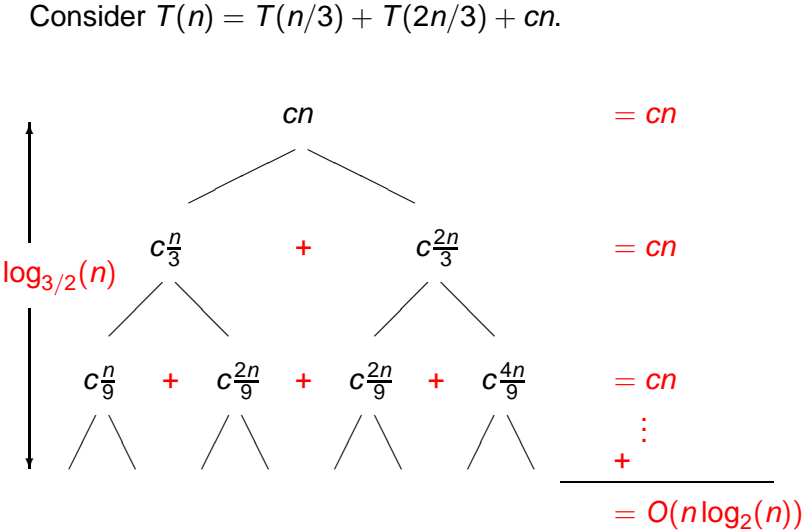
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example

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tree



Summary + Assignments

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another
example

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We covered §4.4 of *Introduction to Algorithms*, 3rd edition by Thomas H. Cormen, Clifford Stein, Ronald L. Rivest, and Charles E. Leiserson.

Assignments:

- 1 Consider $T(n) = 3T(n/2) + n$. Use a recursion tree to derive a guess for an asymptotic upper bound for $T(n)$ and verify the guess with the substitution method.
- 2 Same question as before for $T(n) = T(n/2) + n^2$.
- 3 Same question as before for $T(n) = 2T(n-1) + 1$.

Last homework collection on Monday 29 November:

#1 of L-30, #1 of L-31, #3 of L-32, #2 of L-33, #1 of L-34.

Final exam on Tuesday 7 December, 8-10AM in TH 216.