



程序设计艺术与方法

第六讲 专题解析 ——代码优化



- ⊕ The problem arose in one-dimensional pattern recognition
- ⊕ 输入是 n 维实数数组 x ; 输出连续子数组的和为最大的（最大字段和）。
- ⊕ 例如，输入数组如下：

31	-41	59	26	-53	58	97	-93	-23	84
		↑				↑			
		3				7			

- ⊕ 则返回子数组 $X[3 \dots 7]$, 和为 187.



简单求解程序



- ⊕ 程序显然简单: 对于每一对整数 L 和 U ($1 < L < U < N$)
 - ∅ 计算出 $X[L..U]$ 的和
 - ∅ 检查该和是否大于到目前为止的最大和
- ⊕ 代码示意如下: 时间复杂度 $O(n^3)$

```
MaxSoFar = 0
for i = [0, n)
  for j = [i, n)
    sum = 0
    for k = [i, j]
      sum += x[k]
    /* Sum now contains the sum of X[i..j] */
    MaxSoFar := max(MaxSoFar, Sum)
```



平方级算法（一）



- ⊕ 注意到 $X[L .. U]$ 之间的内在联系
- ⊕ $X[L .. U]$ 的和等于 $X[L .. U-1]$ 的和 + $X[U]$
- ⊕ 时间复杂度可以降为平方级

MaxSoFar = 0

for i = [0, n)

sum = 0

for j = [i, n)

sum += x[j]

MaxSoFar := max(MaxSoFar, Sum)



平方级算法（二）



- ⊕ 另一平方计算法
- ⊕ 建立辅助数组 **cumarr**, $\text{cumarr}[i] = S \ X[1..i]$
- ⊕ $S \ X[i..j] = \text{cumarr}[j] - \text{cumarr}[j - 1]$

cumarr[-1] = 0

for i = [0, n)

cumarr[i] = cumarr[i-1] + x[i]

MaxSoFar = 0

for i = [0, n)

for j = [i, n)

sum = cumarr[j] - cumarr[i-1]

/* sum is sum of x[i..j] */

MaxSoFar := max(MaxSoFar, Sum)



分治算法



- ⊕ It is based on the following divide-and-conquer schema:
 - ∅ *To solve a problem of size N , recursively solve two subproblems of size approximately $N/2$, and combine their solutions to yield a solution to the complete problem.*
- ⊕ The original problem deals with a vector of size N , the natural way to divide it into subproblems is to create two subvectors of approximately equal size, called A and B :





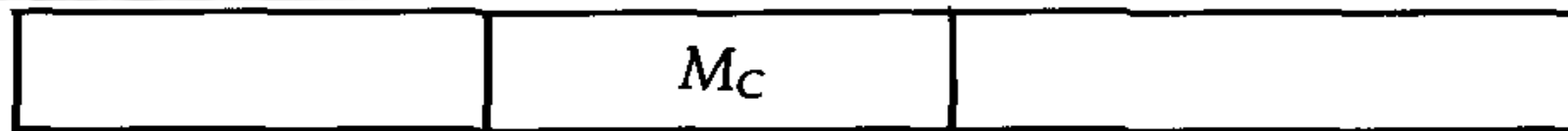
分治算法



- ⊕ We then recursively find the maximum subvectors in A and B, which we'll call M_A and M_B :



- ⊕ It is tempting to think that we have solved the problem because the maximum sum subvector of the entire vector must be either M_A or M_B , or it crosses the border between A and B (which called M_C for the maximum *crossing* the border):





分治算法



- ⊕ Thus our divide-and-conquer algorithm will compute M_A and M_B recursively, compute M_C by some other means, and then return the maximum of the three

```
int maxsum(l, u)
    if (l > u) /* zero elements */
        return 0
    if (l == u) /* 1 elements */
        return max(0, x[l])
    m = (l + u) / 2
    /* find max crossing to left */
    lmax = sum = 0
    for (i=m; i>0; --i)
        sum += x[i]
        lmax = max(lmax, sum)
    /* find max crossing to right */
    rmax = sum = 0
    for (i=m+1; i<=u; ++i)
        sum += x[i]
        rmax = max(rmax, sum)
    return max( lmax+rmax, maxsum(l, m), maxsum(m+1, u) )
```




分治算法



⊕ **answer = maxsum(0, n-1)**

⊕ **$T(1) = O(1)$ and**
 $T(N) = 2T(N/2) + O(N)$
so $T(N) = O(N \log N)$



扫描算法



- ⊕ The maximum is initially zero
- ⊕ Suppose we've solved the problem for $X[1 .. i - 1]$
- ⊕ how can we extend that to a solution for the first i elements?
- ⊕ the maximum sum in the first i elements is either the maximum sum in the first $i - 1$ elements (call *MaxSoFar*)





扫描算法



maxsofar = 0

maxendinghere = 0

for i = [0, n)

// invariant: maxendinghere and maxsofar

//are accurate for x[0..i-1]

maxendinghere = max(maxendinghere+x[i], 0)

maxsofar = max(maxsofar, maxendinghere)



最大子矩阵和问题



⊕ 最大子段和推广到二维

⊕ 描述:

给定一个**2维**的整数矩阵，找出其中具有最大和的子矩阵。一个矩阵的和就是矩阵中所有元素的和。本题中，具有最大和的子矩阵称为最大子矩阵。子矩阵是指位于整个矩阵中任何一个 **1×1** 或更大的连续的子矩阵。



最大子矩阵和示例



例如，在矩阵

0	-2	-7	0
9	2	-6	2
-4	1	-4	1
-1	8	0	-2

中，最大子矩阵在其左下角

9 2
-4 1
-1 8



- ⊕ 最大子段和问题的二维推广.即给定一个 m 行 n 列的矩阵,求其一个子矩阵,行数从 $r_1 \sim r_2$,列数从 $c_1 \sim c_2$,使之全部元素之和为最大
- ⊕ 可以将最大子段和的动态规划解法推广到上述二维情况.其基本思路为:
 - ⊗ 若始行 i_1 与末行 i_2 已给定,则求以 i_1 起始以 i_2 结束的最大子矩阵之和,即等于一个一维的最大子段和问题,
 - ⊗ 数组 x 中元素 $x[j]$ 是第 j 列里从第 i_1 行加到第 i_2 行的所有元素之和.令 $t[i_1, i_2]$ 表示这个行从 i_1 到 i_2 的最大子矩阵和,则求全矩阵的最大子矩阵之和的问题就等同于在 $1 \leq i_1 \leq i_2 \leq m$ 的范围中使 $t[i_1, i_2]$ 最大化
 - ⊗ 上述算法的时间复杂度为 $O(m^2 * n)$
 - ⊗ 整个问题的解决本质上一维最大子段和的问题,不过在另一个维度——行上面,则还是枚举所有的 $1 \leq i_1 \leq i_2 \leq m$ 用打擂的方法比较出最大者.
 - ⊗ 此方法仍然只是在列这个维度上用到了动态规划.