

# Lab:Performance Measurement(MSS)

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2023 年 10 月 8 日

## 1 Question and its introduction

In class, we learn the algorithms of finding the maximum subsequence of a one-dimensional array. Similarly, now we should find algorithms to find the maximum submatrix of a two-dimensional array. So suppose we get a matrix whose size is  $N \times N$ . We should write two basic functions whose time complexities are  $O(N^6)$  and  $O(N^4)$  respectively. Both of them can find maximum submatrix's sum. Additionally, if you have a better algorithm to solve the problem, you can write a function to realize it and get bonus.

## 2 Algorithms and test program

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**Algorithm 1**  $N^6$  Algorithm

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**Require:** matrix[ ][ ], width, height

**Ensure:** *MaxSum* = the sum of maximum submatrix

```
1: MaxSum  $\leftarrow$  0 (next enumerate all submatrix)
2: for BeginWidth = 0 to width-1 do
3:   for EndWidth = BeginWidth to width-1 do
4:     for BeginHeight = 0 to height-1 do
5:       for EndHeight = BeginHeight to height-1 do
6:         ThisSum  $\leftarrow$  0 (now we can get the range of a submatrix)
7:         for i = BeginWidth to EndWidth do
8:           for j = BeginHeight to EndHeight do
9:             ThisSum += matrix[j][i] (get the sum of the submatrix)
10:          end for
11:        end for
12:        if ThisSum > MaxSum then
13:          MaxSum = ThisSum (check and replace MaxSum)
14:        end if
15:      end for
16:    end for
17:  end for
18: end for
19: return MaxSum
```

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**Algorithm 2**  $N^4$  Algorithm

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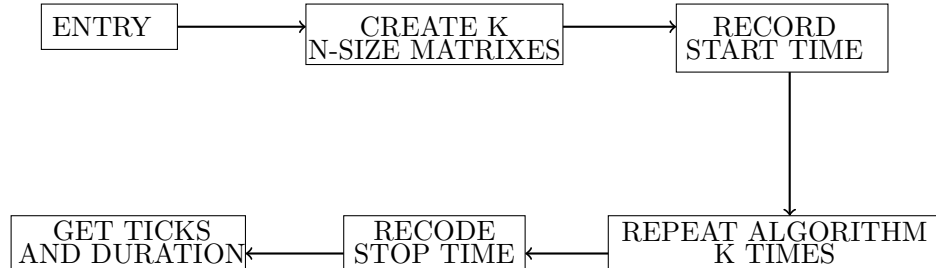
**Require:** matrix[ ][ ], width, height

**Ensure:**  $MaxSum$  = the sum of maximum submatrix

```
1:  $MaxSum \leftarrow 0, Sum[width]$ 
2: for BeginWidth = 0 to width-1 do
3:   for BeginHeight = 0 to height-1 do
4:     Sum[0 to width-1] = 0 (beginning at (BeginWidth, beginHeight))
5:     for i = BeginHeight to height-1 do
6:       LineSum = 0
7:       for j = BeginWidth to width-1 do
8:         LineSum += matrix[i][j]
          (get the sum of [i][BeginWidth] to [i][j])
9:       Sum[j] += LineSum (get the sum from [BeginHeight][BeginWidth] to [i][j])
10:      if Sum[j] > MaxSum then
11:        MaxSum = Sum[j]
12:      end if
13:    end for
14:  end for
15: end for
16: end for
17: return MaxSum
```

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As for test program, the details of test program(Lab1.c) are shown below.



### 3 Time and space complexities

#### 3.1 $N^6$ Algorithm's complexities

Time complexity: Look at the algorithm's pseudo code: Line2 and Line3's time complexity is  $O(N + (N - 1) + \dots + 1) = O(N * (N + 1)/2)$ . Line4 and Line5 are the same. Then notice that Line7 and Line8 can be all submatrix of the main matrix, so the maximum time complexity of Line7 and Line8 are  $O(N^2)$ , so the total time complexity is  $O((\frac{N(N+1)}{2})^2 * N^2) = O(N^6)$

Space complexity: we know that it don't need new array or other data structures. Only a few variables. So the space complexity is  $O(1)$

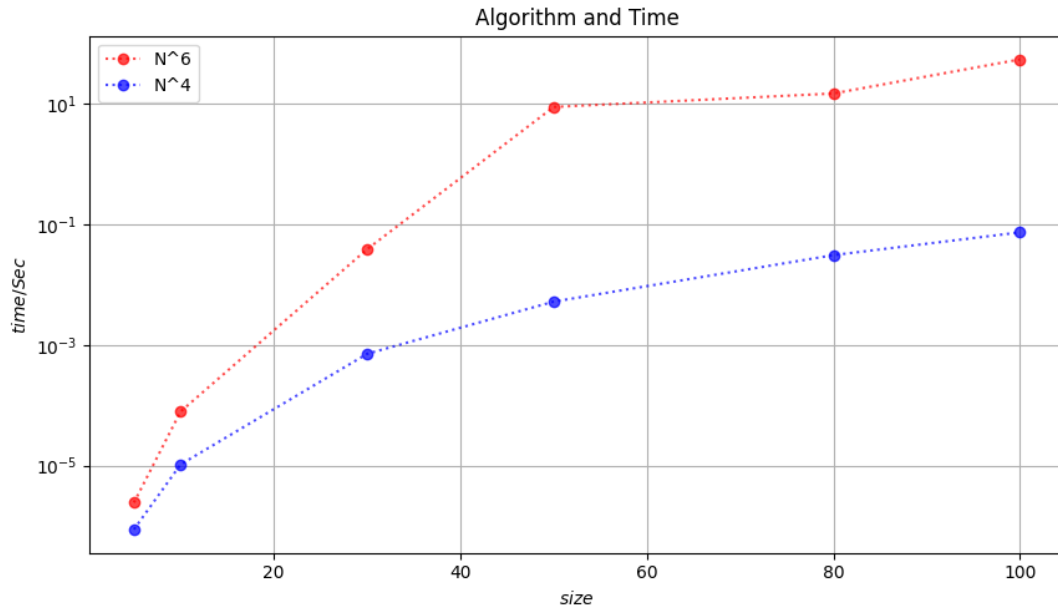
### 3.2 $N^4$ Algorithm's complexities

Time complexity: Look at the algorithm's pseudo code: Line2 and Line3 check all coordinates of matrix, so their time complexity is  $O(N^2)$ . Then Line4 sets Sum[0] to Sum[width-1] as 0, time complexity is  $O(N)$ . From Line5 to Line14, check all submatrix beginning from  $(BeginWidth, BeginHeight)$ , so the maximum time from Line5 to Line14 is  $O(N^2)$ . Then the total time complexity is  $O(N^2 * (N + N^2)) = O(N^4)$

Space complexity: The difference between  $N^4$  and  $N^6$  algorithm is that  $N^4$  algorithm use a array to store the results. And the size of the array is N. So the space complexity of  $N^4$  algorithm is  $O(N)$

## 4 Test and result: N=5,10,30,50,80,100

	N	5	10	30	50	80	100
$O(N^6)$ version	Iterations(K)	500000	70000	100	10	2	1
	Ticks	1213	5484	3853	8800	29431	54101
	Total Time(sec)	1.213	5.484	3.853	8.800	29.431	54.101
	Duration(sec)	2.426e-6	7.834e-5	3.853e-2	8.800	14.716	54.101
$O(N^4)$ version	Iterations(K)	500000	70000	6000	1000	500	100
	Ticks	436	729	4259	5209	15370	7335
	Total Time(sec)	0.4360	0.7290	4.259	5.209	15.370	7.335
	Duration(sec)	8.720e-7	1.041e-5	7.098e-4	5.209e-3	3.074e-2	7.335e-2



Obviously we can find  $N^6$  and  $N^4$  algorithms are different.  $N^4$  Algorithm is faster than  $N^6$ . The reason is that,  $\frac{N^6}{N^4} = N^2$ , if N is very large,  $N^2$  can eliminate the difference of coefficients of order term and become the main factor of run time. And the intrinsical reason is that,  $N^6$  Algorithm checks all submatrix and each check is independent. So finding all submatrix uses  $O(N^4)$  time, and getting the sum of submatrix uses  $O(N^2)$  time —  $O(N^6)$  totally. But  $O(N^4)$  Algorithm just checks all points in matrix, which uses  $O(N^2)$  time. Then checking all sum of submatrix that starts from the point. Array Sum[] help

us remember the sum of submatrix and don't do extra compute. So getting the sum of submatrix uses  $O(N^2)$  time. So  $O(N^4)$  Algorithm is faster than  $O(N^6)$ .

## 5 A better Algorithm and test

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### Algorithm 3 $N^3$ Algorithm

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**Require:** matrix[ ][ ], width, height

**Ensure:**  $MaxSum$  = the sum of maximum submatrix

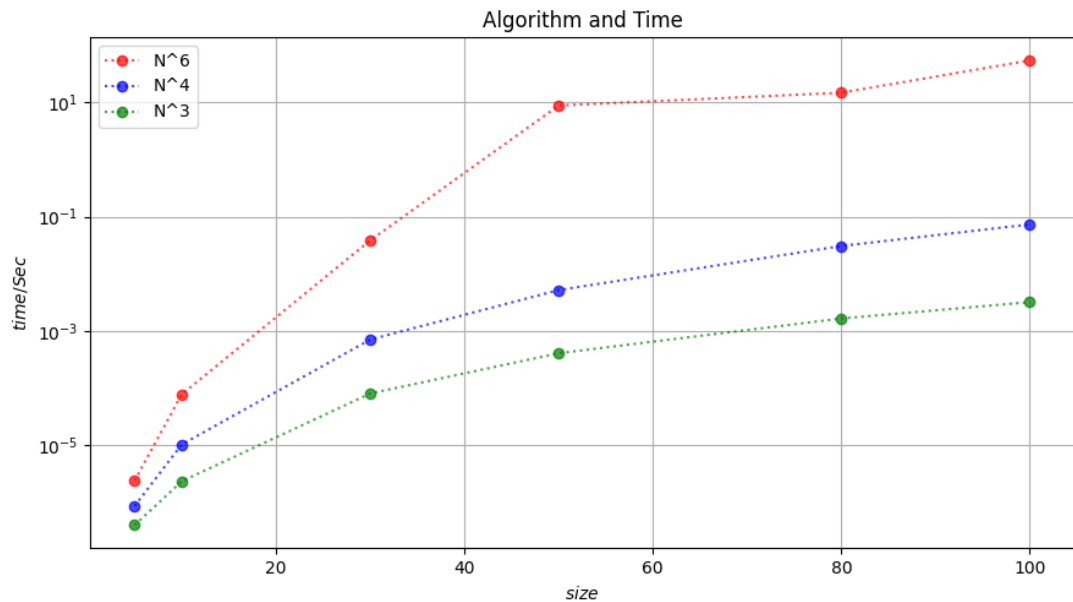
```

1:  $MaxSum \leftarrow 0, Sum[width]$ 
2: for BeginHeight = 0 to height-1 do
3:   Sum[0 to width-1] = 0
4:   for EndHeight = BeginHeight to height-1 do
5:     for k = 0 to width-1 do
6:       Sum[k] += matrix[EndHeight][k]
7:       ThisSum = MaxSubsequenceSum(Sum, width)
8:       if ThisSum > MaxSum then
9:         MaxSum = ThisSum
10:      end if
11:    end for
12:  end for
13: end for
14: return MaxSum

```

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	N	5	10	30	50	80	100
$O(N^3)$ version	Iterations(K)	500000	70000	10000	5000	1500	700
	Ticks	202	165	808	2046	2488	2244
	Total Time(sec)	0.202	0.165	0.808	2.046	2.488	2.244
	Duration(sec)	4.040e-7	2.357e-6	8.080e-5	4.092e-4	1.659e-3	3.206e-3



The  $N^3$  Algorithm's time complexity is  $O(N^3)$  and space complexity is  $O(N)$ . It uses a function called MaxSubsequenceSum: it's the same as teacher's ppt and it can find the max subarray of a one-dimensional array in  $O(N)$  time. So we just need to check height from 0 to height-1: its time complexity is  $O(N^2)$ . So the total time complexity is  $O(N^3)$ . In test we can see that the  $O(N^3)$  Algorithm is faster than  $O(N^4)$  and  $O(N^6)$ , it's better algorithm.