



Competitive Programming, Big-O Notation

PRESENTER: LEUNG MAN HO (LMH)

Competitive Programming – What is it?

- ▶ Solving problems
 - ▶ Logic & Mathematic
 - ▶ Algorithm & Data Structure
 - ▶ Coding
- ▶ Limit
 - ▶ Time Limit
 - ▶ Contest Time
 - ▶ Program Runtime
 - ▶ Memory Limit
- ▶ Example
 - ▶ Google Code Jam
 - ▶ Facebook Hackercup
 - ▶ ACM ICPC

Competitive Programming – What are the problems

- ▶ Topics
 - ▶ Ad-hoc
 - ▶ Mathematics
 - ▶ Number Theory
 - ▶ Combinatorics
 - ▶ Geometry
 - ▶ Graph Theory
 - ▶ String Analysis
 - ▶ Searching
 - ▶ Dynamic Programming
 - ▶ Game Theory
 - ▶ Data Structures
- ▶ OI is not just about Programming

Competitive Programming – Expectation

- ▶ Before the long journey...
- ▶ After this lecture, you should know ways to:
 - ▶ Become a good problem solver
 - ▶ Become a good programmer
 - ▶ Train yourself to be a grandmaster
 - ▶ Outperform your opponents in competitions

Competitive Programming – Flow

- ▶ Learn more about competitive programming
 - ▶ Programming Competitions & Scoring
 - ▶ Tasks
- ▶ Learn ways to become better
 - ▶ Foundation of Competitive Programming
 - ▶ Strategies & Tricks
 - ▶ Self Learning Platform

Competitive Programming

– Programming Competitions & Scoring

- ▶ HKOI-Final-Style
 - ▶ Individual
 - ▶ Score given to each correct test cases
 - ▶ Live Feedback
 - ▶ Partial solution is important
- ▶ IOI-Style (HKOI-TFT-2014-Style)
 - ▶ Individual
 - ▶ Batch processing
 - ▶ Score only given when passes all data in a batch
 - ▶ Live Full Feedback
 - ▶ Partial solution is important

Competitive Programming

– Programming Competitions & Scoring

- ▶ ACM-ICPC-Style
 - ▶ Team-Based (3)
 - ▶ No partial credit
 - ▶ Time penalty
 - ▶ Accepted Time
 - ▶ #Wrong Submission
 - ▶ Allow use of "Weapon"
 - ▶ Live Full Feedback
 - ▶ Score ~ #Tasks Solved & Time penalty
- ▶ Codeforces/Topcoder-Style
 - ▶ Individual
 - ▶ No partial credit
 - ▶ Time penalty
 - ▶ Accepted Time
 - ▶ #Wrong Submission
 - ▶ Pretest & Hack system
 - ▶ Live Feedback

Competitive Programming – Tasks

- ▶ Normal
 - ▶ Input & Output
- ▶ Interactive
 - ▶ Ask question to system repetitively, compute solution using system response
 - ▶ Game
 - ▶ Example
 - ▶ Given an unknown sequence of A
 - ▶ Ask the system to compare $A[i]$ and $A[j]$
 - ▶ Output the sorted order of A within minimal possible questions

Competitive Programming – Tasks

- ▶ Output Only
 - ▶ Challenging Tasks
 - ▶ Allow more offline precompute & Manual Computation
- ▶ Communication Task
 - ▶ Write two (or more) programs that communicate to each other by specific interface (i.e. limited information)
 - ▶ Encryption & Decryption
 - ▶ Example : HKOI 2014 Senior Dividing the Cities

Competitive Programming

- Foundation of Competitive Programming

- ▶ Algorithm
 - ▶ Procedure to solve problems
 - ▶ Examples
 - ▶ Sorting – Bubble Sort, Merge Sort, Quick Sort
 - ▶ Shortest Path – Ford Warshall, Bellman Ford, SPFA
 - ▶ Searching – BFS, DFS
- ▶ Data Structure
 - ▶ Manner to organize data
 - ▶ Examples
 - ▶ Hash Table
 - ▶ Segment Tree
- ▶ Both are related
- ▶ Learning these knowledge is important
 - ▶ If I have seen farther than others, it is because I was standing on the shoulders of giants
 - ▶ Don't reinvent the wheels

Competitive Programming

- Strategies & Tricks

- ▶ Reading the problems
- ▶ Choosing a problem
- ▶ Reading the problem
- ▶ Thinking
- ▶ Coding
- ▶ Testing
- ▶ Finalizing the program

Competitive Programming

- Reading the problems

- ▶ Title
- ▶ Problem Description
- ▶ Constraints
- ▶ Input/Output Specification
- ▶ Sample Input/Output
- ▶ Scoring

Competitive Programming

- Reading the problems

- ▶ Constraints
 - ▶ Range of variables
 - ▶ Execution Time
- ▶ NEVER make assumptions yourself
 - ▶ Ask whenever you are not sure
 - ▶ (Do not be afraid to ask questions!)
- ▶ Read every word carefully
- ▶ Make sure you understand before going on

Competitive Programming - Thinking

- ▶ Classify the problem into certain type(s)
 - ▶ Oiers Intinct
 - ▶ Required Algorithm/Data Structure?
- ▶ Rough works
- ▶ Special cases, boundary cases
- ▶ No idea? Give up first, do it later. Spend time for other problems.

Competitive Programming - Thinking

- ▶ Make sure you know what you are doing before coding
 - ▶ Hand writing code could be useful
- ▶ Points to note:
 - ▶ Complexity (BOTH time and space)
 - ▶ Give up solutions when it greatly fail in complexity analysis
 - ▶ Coding difficulties

Competitive Programming - Coding

- ▶ Short variable names
 - ▶ Use `i`, `j`, `m`, `n` instead of `no_of_schools`, `name_of_students`, etc.
- ▶ No comments needed
- ▶ As long as YOU understand YOUR code, okay to ignore all “appropriate” coding practices

Competitive Programming - Coding

- ▶ Avoid using floating point variables if possible
 - ▶ real, double
- ▶ Do not do small (aka useless) “optimizations”
- ▶ Save and compile frequently

Competitive Programming - Testing

- ▶ Sample Input/Output

“A problem has sample output for two reasons:

1. To make you understand what the correct output format is
2. To make you believe that your incorrect solution has solved the problem correctly ”

- ▶ Manual Test Data

- ▶ Program-generated Test Data (if time allows)

- ▶ Boundary Cases (0, 1, other smallest cases)

- ▶ Large Cases (to check for TLE, overflows, etc)

- ▶ Tricky Cases

- ▶ Test by self-written program (again, if time allows)

Competitive Programming - Debugging

- ▶ Debugging – find out the bug, and remove it
 - ▶ Easiest method: `writeln/printf/cout`
- ▶ Debug message

Competitive Programming - Finalizing

- ▶ Check output format
 - ▶ Any trailing spaces? Missing end-of-lines? (for printf users, this is quite common)
 - ▶ better test once more with sample output
 - ▶ Remember to clear those debug messages
- ▶ Check I/O – filename? stdio?
- ▶ Check exe/source file name
- ▶ Is the executable updated?
- ▶ Method of submission?
- ▶ Try to allocate ~5 mins at the end of competition for finalizing

Competitive Programming - Tricks

- ▶ Solve for simple cases
 - ▶ 50% (e.g. slower solution, brute force)
 - ▶ Special cases (smallest, largest, etc)
 - ▶ Incorrect greedy algorithms
 - ▶ Very often, slow and correct solutions get higher scores than fast but wrong solutions
- ▶ Hard Code
 - ▶ “No solution”
 - ▶ Stupid Hardcode: `begin writeln(random(100)); end.`
 - ▶ Naïve hardcode: “if input is x, output hc(x)”
 - ▶ More “intelligent” hardcode (sometimes not possible):
 - ▶ pre-compute the values, and only save some of them

Competitive Programming - Pitfalls

- ▶ Misunderstanding the problem
- ▶ Not familiar with competition environment
- ▶ Output format
- ▶ Using complex algorithms unnecessarily
- ▶ Choosing the hardest problem first

Competitive Programming - Summary

- ▶ They are only soft skills
 - ▶ Useful
 - ▶ Not Panacea
- ▶ Hard Skills
 - ▶ Studying Algorithm & Data Structure
 - ▶ Practice
 - ▶ Contest Experience

Becoming Grandmaster – Online Judge

- ▶ HKOI Judge System
 - ▶ Updated, what's new?
 - ▶ User Friendliness
 - ▶ Elegant
 - ▶ Features
 - ▶ <https://judge.hkoi.org>
- ▶ Peking University Online Judge
 - ▶ <http://poj.org/>
- ▶ UVa Online Judge
 - ▶ <http://uva.onlinejudge.org/>

Becoming Grandmaster – POJ

- ▶ Unlimited Tasks
 - ▶ Wide range of difficulties & topics
- ▶ Large Community
 - ▶ Don't know how to do?
 - ▶ Discussion Board
 - ▶ Search for problem's name
 - ▶ Don't know which problems to start?
 - ▶ Search for classification
- ▶ Great platform to test your skill
 - ▶ Test your algorithm & data structure's implementation

Becoming Grandmaster – Online Contest

- ▶ HKOI Mini-competitions
 - ▶ Larger range of difficulties would be provided this year
- ▶ Codeforces
 - ▶ Two divisions
 - ▶ Contest per week (approx.)
 - ▶ <http://codeforces.com/>
- ▶ Topcoder
 - ▶ Advance
 - ▶ <http://www.topcoder.com/>

Becoming Grandmaster – Codeforces

- ▶ Nice UI
- ▶ Suitable level for HKOlers
- ▶ Regular Competitions
- ▶ Exciting rating system
- ▶ Large community
- ▶ Mutual learning system
 - ▶ Can read others' submission

Becoming Grandmaster – Hall of Fame

RATING FRIENDS RATING

Country: Hong Kong, 92 City: any city

Organization: any organization

Rating				
	Who	#	=	
1 (277)	 alex20030190	33	2321	
2 (281)	 GagGuy	104	2318	
3 (516)	 AlanC	26	2223	
4 (612)	 Sampson	54	2197	
5 (695)	 murphy	13	2172	
6 (698)	 thinfaifai	24	2171	
7 (760)	 whhone	34	2156	
8 (810)	 I_know_nothing	68	2144	
9 (1033)	 tckwok0	3	2093	
10 (1218)	 ytau	20	2057	

Becoming Grandmaster – Is it possible?

International master **I_know_nothing** ★

Theogry Leung, [Sha Tin, Hong Kong](#)
From [CUHK](#)

Contest rating: **2144** (max. **grandmaster**, 2217)

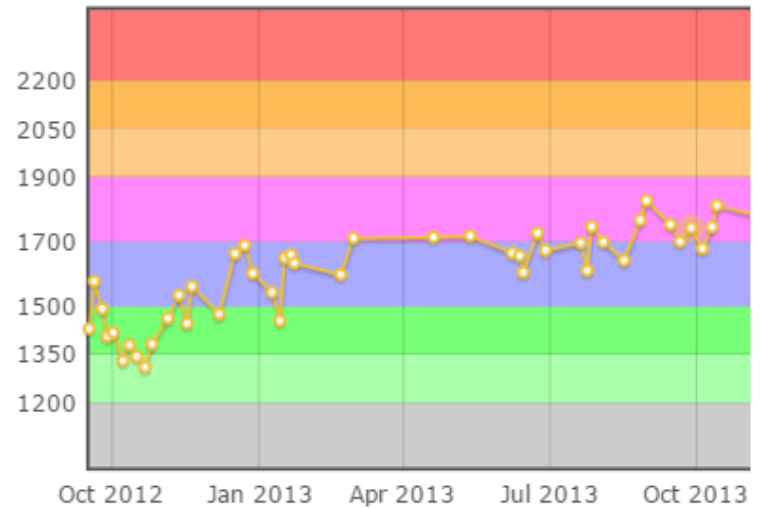
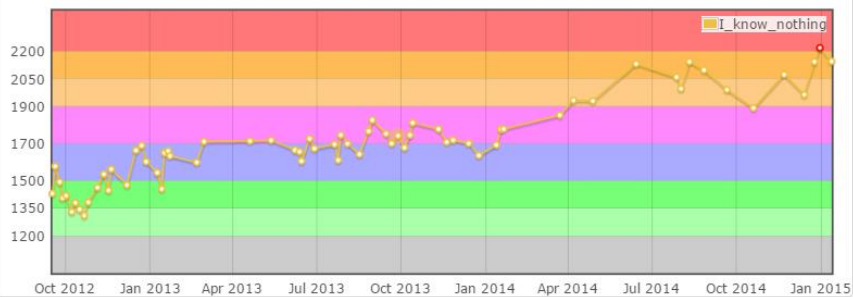
Contribution: **+13**

Last visit: 4 hours ago

Registered: 2 years ago

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Becoming Grandmaster - Key

- ▶ Patience
 - ▶ OI is a big topic
 - ▶ Usually take years to master
- ▶ Passion
 - ▶ Road to Grandmaster is tough
 - ▶ Self Learning
- ▶ Practice
 - ▶ Problems
 - ▶ Contests

Becoming Grandmaster - Suggestion

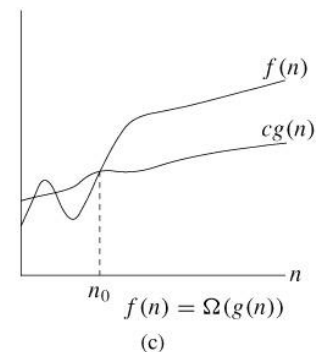
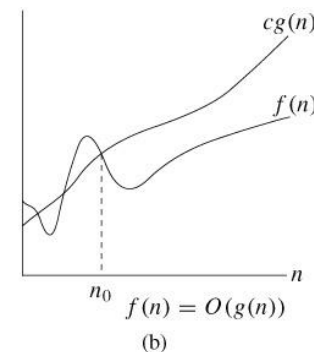
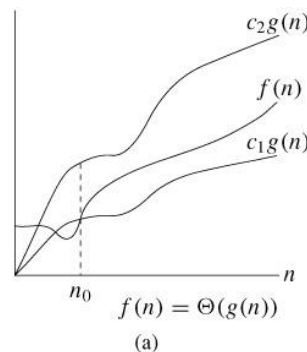
- ▶ Communicate with cows
 - ▶ Online
 - ▶ Live (HKOI Training)
- ▶ Learn from cows
 - ▶ Read their code, learn their programming practice
- ▶ Learn from mistakes
 - ▶ Re-do past problems in contests
- ▶ DO NOT fear of failing
 - ▶ Confront your weaknesses
 - ▶ Fastest way to learn

Big O Notation – Usage

- ▶ Describe functions' growth rate
- ▶ In OI sense, Big-O is used to...
 - ▶ Analysis Complexity
 - ▶ Time
 - ▶ Memory
 - ▶ Evaluate Algorithms & Data Structures
- ▶ After this chapter, you should know how to ...
 - ▶ Understand why others' / your solution is better
 - ▶ Estimate your scores in competitions
 - ▶ Save time from useless optimization

Big O Notation – Definition (Mathematics Sense)

- ▶ $f(x) = O(g(x)) \leftrightarrow \exists x_0, M: |f(x)| \leq M |g(x)|, \forall x > x_0$
- ▶ Forget this after getting the feeling of what Big-O is
- ▶ Big-O is upper bound of a function
- ▶ It says that there is some point x_0 past which $M|g(x)|$ is always at least as large as $|f(x)|$
- ▶ There is other O notations
 - ▶ Small O
 - ▶ Omega



Big O Notation – Computation

- ▶ Generally interested in tightest upper bound
- ▶ Not interested to constant, smaller term
 - ▶ $O(f(n)) + O(g(n)) = \max(O(f(n)), O(g(n)))$
- ▶ Example
 - ▶ $O(6n^2 + 4n + 2) = O(n^2)$

Big O Notation – Exercises

- ▶ State the Big O Notation of the following functions

- ▶ $f(n) = 689$

- ▶ $f(n) = 689n$

- ▶ $f(n) = 6n + 89$

- ▶ $f(n) = 6n^8 + 9n$

- ▶ $f(n) = 6^n + 8n^9$

Big O Notation – Exercises Answers

- ▶ State the Big O Notation of the following functions
 - ▶ $f(n) = 689$
 - ▶ $O(n) = 1$
 - ▶ $f(n) = 689n$
 - ▶ $O(n) = n$
 - ▶ $f(n) = 6n + 89$
 - ▶ $O(n) = n$
 - ▶ $f(n) = 6n^8 + 9n$
 - ▶ $O(n) = n^8$
 - ▶ $f(n) = 6^n + 8n^9$
 - ▶ $O(n) = 6^n$

Big O Notation – Order of Recurrence Function (Challenging)

- ▶ Recurrence Function

- ▶ Function calling itself

- ▶ Base Cases

- ▶ Example

- ▶ Fibonacci

- ▶ $f(n) = f(n-1) + f(n-2), n \geq 2$

- ▶ $f(n) = 1, n \leq 1$

- ▶ 1, 1, 2, 3, 5, 8,.....

- ▶ Binary Search

- ▶ $f(n) = f\left(\frac{n}{2}\right) + 1, n \geq 2$

- ▶ $f(n) = 1, n \leq 1$

Big O Notation – Order of Recurrence Function (Challenging)

▶ Hard Way

▶ Find the exact form of function

- ▶ Solving Characteristic Function
- ▶ Guess & Verify Method
- ▶ Attend our Mathematics (I) :D

▶ Exact Form of Fibonacci Function = $\frac{1}{\sqrt{5}} \left(\left(\frac{1+\sqrt{5}}{2} \right)^n - \left(\frac{1-\sqrt{5}}{2} \right)^n \right)$

▶ Easy way

▶ Master Theorem

- ▶ $T(n) = aT\left(\frac{n}{b}\right) + f(n), a \geq 1, b > 1$
- ▶ Common form for computing algorithm

Big O Notation – Master Theorem

- ▶ $T(n) = aT\left(\frac{n}{b}\right) + f(n), a \geq 1, b > 1$
- ▶ $n^c \log^k n$ is strict bound of $f(n)$ where $c = \log_b a$
→ $n^c \log^{k+1} n$ is also strict bound of $T(n)$
- ▶ Example: $T(n) = 2T\left(\frac{n}{2}\right) + n$
 - ▶ $a = 2, b = 2, c = 1, f(n) = n$
 - ▶ $n^c \log^k n$ is strict bound of $f(n)$ where $c = 1, k = 0$
 - ▶ $\log_b a = \log_2 2 = 1 = c$
 - ▶ $n^c \log^{k+1} n = n \log n$ is also strict bound of $T(n)$
 - ▶ $T(n)$ is # elementary operation in Merge Sort
- ▶ There are other forms too

Big O Notation

– Applications in OI

- ▶ Time Complexity
 - ▶ How long the program run
 - ▶ ~ Number of elementary operations
- ▶ Memory Complexity
 - ▶ How much ram it consumed
 - ▶ ~ Number of basic data slot
- ▶ Generally interested in worst case performance

Big O Notation – Time Complexity

- ▶ Intuition
 - ▶ Imagine a secret counter behind each elementary operations
 - ▶ How large is it after your program run? (Under Big-O)
- ▶ Common Time Complexities
 - ▶ $O(1)$, Constant
 - ▶ $O(\log n)$, Logarithmic
 - ▶ $O(n)$, Linear
 - ▶ $O(n \log n)$, Linearithmic
 - ▶ $O(n^2)$, Quadratic
 - ▶ $O(n^3)$, Cubic
 - ▶ $O(2^n)$, Exponential
 - ▶ $O(n!)$, Factorial

Big O Notation - $O(1)$, Constant

- ▶ Summation of first n non-negative integers

$$\text{sum} = n * (n + 1) / 2$$

- ▶ Summation of first 10000 non-negative integers

```
FOR i = 1 TO 10000 DO
```

```
    sum = sum + i
```

```
ENDFOR
```

- ▶ Runtime do not scale with any variables

Big O Notation - $O(\log n)$, Logarithmic

► Binary Search

```
WHILE (max >= min) DO
    mid = midpoint(min, max)
    IF (A[mid] = key)
        // key found at index mid
    ELSEIF (A[mid] < key)
        min = mid + 1
    ELSE
        max = mid - 1
ENDWHILE
```

► Log base does not matter

► Change-Of-Base Formula

► $\log_b x = \frac{\log_d x}{\log_d b}$

► Factor of constant

► Counting number of bits

```
WHILE (x != 0) DO
    bits = bits + x MOD 2
    x = x / 2
ENDWHILE
```

Big O Notation - $O(n)$, Linear

- Read n integer as input

```
FOR i = 1 to n DO  
    INPUT (A[i])  
ENDFOR
```

- Finding maximum value among n integer

```
FOR i = 1 to n DO  
    ans = MAX(ans, A[i])  
ENDFOR
```

Big O Notation

- $O(n \log n)$, Linearithmic

► Merge Sort

```
MERGESORT(a, b)
```

```
    HANDLE BASE CASE
```

```
    mid = (a + b) / 2
```

```
    MERGESORT(a, mid)
```

```
    MERGESORT(mid + 1, b)
```

```
    MERGE(a, mid, b)
```

```
END
```

► $T(n) = 2T\left(\frac{n}{2}\right) + n$

► Master Theorem

Big O Notation - $O(n^2)$, Quadratic

► Bubble Sort

```
FOR i = 1 TO n DO
  FOR j = 2 TO n - i DO
    IF (A[j] > A[j - 1])
      swap(A[j], A[j - 1])
    ENDIF
  ENDFOR
ENDFOR
```

► Initialize a 2D array ($n \times n$)

```
FOR i = 1 to n DO
  FOR j = 1 to n DO
    A[i][j] = 0;
  ENDFOR
ENDFOR
```

► #Max swaps = #Max Inversions = $\frac{n \times (n - 1)}{2}$

Big O Notation - $O(n^3)$, Cubic

- ▶ Counting number of different triangles with integer side-length within n

```
FOR i = 1 TO n DO
  FOR j = i TO n DO
    FOR k = j TO n DO
      IF (i + j > k AND i + k > j AND j + k > i)
        cnt = cnt + 1
      ENDIF
    ENDFOR
  ENDFOR
ENDFOR
```

Big O Notation - $O(2^n)$, Exponential

► Exhaust all N-bitset

```
BITSET(x)
  IF (x = n)
    OUTPUT(Bit)
  ENDIF
  Bit[n] = 0
  BITSET(n + 1)
  Bit[n] = 1;
  BITSET(n + 1)
END
```


Big O Notation

- $O(n!)$, Factorial

- ▶ Exhaust all permutations of $(1..n)$

```
WHILE HAS_NEXT_PERMUTATION DO  
  OUTPUT (NEXT_PERMUTATION)
```

Big O Notation – Guess the solution

- ▶ Common Skill
- ▶ Assumption
 - ▶ Modern computer can perform $\sim 10^7 - 10^8$ elementary operations
 - ▶ Constant factor hidden in Big O is insignificant
 - ▶ Constraints are well set :o)
- ▶ Conversion Table
 - ▶ Highly Machine & Compiler Dependent
 - ▶ CPU
 - ▶ Flags
 - ▶ Only as reference, be FLEXIBLE!
- ▶ Can you evaluate your Final score now?

n	Worst Acceptable Solution
$10^{10^8} < n$	$O(1)$
$10^6 < n \leq 10^{10^8}$	$O(1)$ or $O(\log n)$
$10^4 < n \leq 10^6$	$O(n)$ or $O(n \log n)$
$500 < n \leq 10^4$	$O(n^2)$
$100 < n \leq 500$	$O(n^3)$
$25 < n \leq 100$	$O(n^4)$
$12 < n \leq 25$	$O(2^n)$
$1 < n \leq 12$	$O(n!)$

Big O Notation – Memory Complexity

- ▶ Similar to Time Complexity
- ▶ Beware of
 - ▶ Memory limit
 - ▶ Size of self-declared data structure
 - ▶ Size of imported data structure (map, vector, etc)
 - ▶ Stack overflow

END