

# Problem Set 2: Introduction to Analysis of Algorithms and Running Time Calculations

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# Introduction to Analysis of Algorithms

## Problem 1

Order the following functions in increasing order by growth rate:

$N^3$ ,  $2^{N/2}$ ,  $N \log \log N$ ,  $N^2$ ,  $2/N$ ,  $N \log^2 N$ ,  $N \log N$ ,  $N$ ,  $N \log(N^2)$ ,  $N^{1.5}$ ,  $2^N$ ,  $N^2 \log N$ ,  $12$ ,  $\sqrt{N}$

Indicate which functions grow at the same rate.

## Problem 2

Alice is a security consultant. Her consulting contract states that she earns a fee of 2 dollar-bucks for the first hour of work and that her hourly fee is squared for each subsequent hour of work, i.e. the fee progresses: 2 dollar-bucks, 4 dollar-bucks, 16 dollar-bucks, and so on.

- What is Alice's fee for her  $N$ th hour?
- Give a big-O estimate for the number of hours of work it would take for Alice's **hourly** fee to reach  $D$  dollar-bucks.
- Give a big-O estimate for the number of hours of work it would take for Alice's **total** fee to reach  $D$  dollar-bucks.

## Problem 3

An algorithm running on a particular computer takes 700 microseconds ( $1\mu s = 10^{-6}s$ ) for input size 100. How large a problem (in terms of input size) can be solved in 3 minutes if the algorithm's running time is the following (assume low-order terms are negligible)?

*Give your answer in scientific notation:  $1.234e5$  ( $1.234 * 10^5 \approx 123,400$ ).*

*Hint: Compute the constant  $C$  based on the given information, then solve for  $N$ .*

- linear:  $O(N)$
- linearithmic:  $O(N \log_2 N)$
- quadratic:  $O(N^2)$
- cubic:  $O(N^3)$
- exponential:  $O(2^N)$

## Problem 4

Programs Foo and Bar are analyzed and found to have worst case running times no greater than  $221N\log_2 N$  and  $3N^2$ , respectively. Answer the following questions, if possible:

- A. Which program has the better guarantee on the running time for values of  $N < 100$ ?
- B. Which program has the better guarantee on the running time for values of  $N > 10000$ ?
- C. For what value of  $N$  are the worst case running times approximately equal?
- D. Is it possible that Bar will run faster than Foo on all possible inputs? Why (not)?

# Running Time Calculations

## Problem 1

For each of the following three program fragments:

- A. Use big-O notation to analyze the running time (i.e. the value of sum).
- B. Implement the code in any programming language and give the actual running time for several values of N.
  - a. submit evidence you did this, i.e. the code you wrote
- C. Compare your analysis with the actual running times.
  - a. submit evidence you did this, i.e. tables or plots of data

### Fragment 1

```
sum = 0
for i from 1 to n do
    sum = sum + 1
end
```

### Fragment 2

```
sum = 0
for i from 1 to n do
    for j from 1 to i do
        sum = sum + 1
    end
end
```

### Fragment 3

```
sum = 0
for i from 1 to n do
    for j from 1 to i^2 do
        for k from 1 to j do
            sum = sum + 1
        end
    end
end
```

```
end
```

## Problem 2

For each of the following operations, write out (e.g. in pseudocode) the algorithm **you** typically use for **hand-calculations** and give a big-O estimate of the time complexity of that algorithm.:

- A. Add two  $N$ -digit integers
- B. Multiply two  $N$ -digit integers
- C. Divide two  $N$ -digit integers

## Problem 3

Use big-O to estimate how much time is required to compute  $f(x) = \sum_{i=0}^N a_i x^i$

- A. using naive exponentiation?
- B. using fast exponentiation?
- C. using the following algorithm?

```
value = 0
for i from n to 0 by -1 do
    value = value * x + a[i]
end
```

## Puzzle Problem [optional]

*This one nerd-sniped me, so I'm sharing the fun.*

***This problem is NOT part of the problem set, it is just for fun.***

Show that  $X^{62}$  can be computed with only eight (8) multiplications.

*Extra Challenge:*

What is the smallest power  $k$  such that  $X^k$  requires at least eight multiplications?