
Algorithm Discovery

Topics:

Attributes of Algorithms
Measuring Efficiency

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Attributes of Algorithms

- **Correctness**
 - Give a correct solution to the problem!
- **Ease of understanding**
 - Clarity and ease of handling
- **Program maintenance**
 - Fix errors
 - Extend the program to meet new requirements
- **Efficiency**
 - **Time:** How long does it take to solve the problem?
 - **Space:** How much memory is needed?

A Choice of Algorithms

- Possible to come up with several different algorithms to solve the same problem.
- **Which one is the best?**
 - Most efficient: Time vs. Space
 - Easiest to maintain?
- **How do we measure time efficiency?**
 - Running time?
 - Number of executed operations?

Measuring Efficiency

- Need a **metric** to measure efficiency of algorithms
 - **Running Time:** How long does it take to solve the problem?
 - * Depends on machine speed
 - **Number of Operations:** How many operations does the algorithm execute?
 - * Better metric but a lot of work to count all operations
 - **Number of Fundamental Operations:** How many “fundamental operations” does the algorithm execute?
- Depends on size and type of input, interested in knowing:
 - **Best-case, Worst-case, Average-case** behavior
- **Need to analyze the algorithm!**

Example: Average of n numbers (I)

Problem: Find the average of n numbers

```
1. get n, A1, A2, ..., An
2. set sum to 0
3. set i to 1
4. while (i <= n) {
5.     set sum to (sum + Ai)
6.     set i to (i + 1)
7. }
8. set average to sum/n
9. print average
```

- **How many steps does the algorithm execute?**
 - Steps 2, 3, 7, and 8 are executed once.
 - Steps 4, 5, and 6 depend on the input size n .
- **Total Number of Executed operations:**

$$1 + 1 + (n + 1) + n + n + 1 + 1 = 3n + 5$$

Example: Average of n numbers (II)

Problem: Find the average of n numbers

```
1. get n,A1,A2,...,An
2. set sum to 0 ----- 1 operation    --> executed once
3. set i to 1    ----- 1 operation    --> executed once
4. while (i <= n) { ----- 1 operation    --> (n+1) repetitions
5.     set sum to (sum + Ai) ---- 1 operation    --> n repetitions
6.     set i to (i + 1) ----- 1 operation    --> n repetitions
   }
7. set average to sum/n ----- 1 operation    --> executed once
8. print average ----- 1 operation    --> executed once
```

Sequential Search – Analysis

```
1. get Name, N1, ..., Nn, T1, ..., Tn
2. set i to 1 and set Found to NO
3.   while (i <= n and FOUND = NO) {
4.       if Name = Ni then
5.           print Ti
6.           set Found to YES
7.       else set i to i+1           }
8. if Found = NO then
9.   print "Sorry, name not in directory"
```

- **How many steps does the algorithm execute?**
 - Steps 2, 5, 6, 8 and 9 are executed at most once.
 - Steps 3, 4, and 7 depend on input size.
- **Worst case:** Steps 4 and 7 are executed at most n -times and step 3 $n+1$ times.
- **Best case:** Steps 4 and 7 are executed only once.
- **Average case:** Steps 4 and 7 are executed approximately $(n/2)$ -times.

Sequential Search – Worst Case Behavior

Worst-Case: The name is not in the list:

1. get Name, N1, ..., Nn, T1, ..., Tn		
2. set i to 1 and set Found to NO	----- 2 operations	--> executed once
3. while (i <= n and FOUND = NO) {	-- 2 operations	--> (n+1) repetitions
4. if Name = Ni then	----- 1 operation	--> n repetitions
5. print Ti		
6. set Found to YES		
7. else set i to i+1 }	----- 1 operation	--> n repetitions
8. if Found = NO then	----- 1 operation	--> executed once
9. print "Sorry, name not in directory"	1 operation	--> executed once

- Steps 2, 8 and 9 are executed once.
- Steps 5 and 6 are not executed.
- Step 3 is executed n+1-times.
- Steps 4 and 7 are executed n-times.
- **Total Number of Executed operations:**

$$2 + 2 \times (n + 1) + n + n + 2 = 4n + 6$$

Order of Magnitude: Big-O Notation

- We are:
 - Not interested in knowing the exact number of operations the algorithm performs.
 - **Mainly interested in knowing how the number of operations grows with increased input size!**
- Why?
 - Given large enough input, the algorithm with faster growth will execute more operations.
- **Order of Magnitude, $O(\dots)$, measures how the number of operations grows with input size n .**

Order of Magnitude

- Not interested in the exact number of operations, for example, algorithms where total operations are:
 - n
 - $6n$
 - $6n + 278$
 - $5000n + 2000$
- are all of order $O(n)$
 - For the previous algorithms, the total number of operations grows approx. proportionally with input size (given large enough n).

Linear Algorithms – $O(n)$

- If the number of operations grows in proportion, or linearly, with input size, it is a **linear** algorithm, $O(n)$.
- **Example:** Sequential search is linear, denoted $O(n)$.

Constant Algorithms – $O(1)$

- If the number of operations remains the same, e.g. problem size doubles but number of operations remains the same, it is a **constant** algorithm, **$O(1)$** .
- **Example:** Calculate the sum of all the integers from 1 to n with the Gauss algorithm

```
get n
set result to  $((n+1)*n)/2$ 
print result
```

Summary

- We are concerned with the efficiency of algorithms
 - Time- and Space-efficiency
 - Need to analyze the algorithms
- Order of magnitude measures the efficiency
 - E.g. $O(1)$, $O(n)$, $O(n^2)$, ...
 - Measures how fast the work grows as we increase the input size n .
 - Desirable to have slow growth rate.