

CSEN102 – Introduction to Computer Science

Lecture 6:

Algorithm Discovery: Attributes of Algorithms, Measuring Efficiency

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Attributes of algorithms

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 - 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?

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- 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

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?

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 - **Best-case**, **Worst-case**, **Average-case** behavior

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 - **Number of Fundamental Operations**: How many “**fundamental operations**” does the algorithm execute?
- Depending on **size** and **type** of input, we are interested in:
 - **Best-case**, **Worst-case**, **Average-case** behavior
- **Need to analyze the algorithm!**

Example: Average of n numbers – counting

Problem: Find the average of n numbers

```
1 list_A = eval(input())
2 n = len(list_A)
3 sum = 0
4 i = 0
5 while i < n:
6     sum = (sum + list_A[i])
7     i = (i + 1)
8 average = sum/n
9 print(average)
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 - Steps 1, 2, 3, 4, 8, and 9 are executed **once**.

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```

- How many steps does the algorithm execute?
 - Steps 1, 2, 3, 4, 8, and 9 are executed **once**.
 - Steps 5, 6, and 7 **depend on the input size n** .

Example: Average of n numbers – doing the sum

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Total number of executed operations

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$$1 + 1$$

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Total number of executed operations

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5 while i < n:           1 operation => (n+1) repetitions
6     sum = sum + list_A[i]
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Total number of executed operations

$$1 + 1 + 1 + 1 + (n + 1)$$

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Total number of executed operations

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4	<code>i = 0</code>	1 operation => executed once
5	<code>while i < n:</code>	1 operation => $(n+1)$ repetitions
6	<code>sum = sum + list_A[i]</code>	1 operation => n repetitions
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Total number of executed operations

$$1 + 1 + 1 + 1 + (n + 1) + n + n + 1 + 1 = 3n + 7$$

Sequential search – Analysis

```
1 Name = eval(input())
2 list_N = eval(input())
3 list_T = eval(input())
4 n = len(list_N)
5 i = 0
6 Found = False
7 while Found == False and i < n:
8     if Name == list_N[i]:
9         print(list_T[i])
10        Found = True
11    else:
12        i = i + 1
13 if Found == False:
14    print("sorry, name is not in directory")
```

How many steps does the algorithm execute?

Sequential search – Analysis

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So what is the running time now? (focus on the loop)

Sequential search – Analysis

How many steps does the algorithm execute?

- Steps 1, 2, 3, 4, 5, 6, 9, 10, 13 and 14 are executed **at most** once.

So what is the running time now? (focus on the loop)

- **Worst case:**

Sequential search – Analysis

How many steps does the algorithm execute?

- Steps 1, 2, 3, 4, 5, 6, 9, 10, 13 and 14 are executed **at most** once.
- Step 7 is executed **at most** $n + 1$ times.

So what is the running time now? (focus on the loop)

- **Worst case:** Steps 8 and 12 are executed at most n times and step 7 $n + 1$ times.

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How many steps does the algorithm execute?

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- **Worst case:** Steps 8 and 12 are executed at most n times and step 7 $n + 1$ times.
- **Best case:**

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So what is the running time now? (focus on the loop)

- **Worst case:** Steps 8 and 12 are executed at most n times and step 7 $n + 1$ times.
- **Best case:** Step 7 is executed exactly **twice**. Step 8 is executed only **once**.

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- **Average case:**

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- **Worst case:** Steps 8 and 12 are executed at most n times and step 7 $n + 1$ times.
- **Best case:** Step 7 is executed exactly **twice**. Step 8 is executed only **once**.
- **Average case:** Steps 8 and 12 are executed approximately $\frac{n}{2}$ times.

Sequential search – Worst case behavior

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1 Name = eval(input())
2 list_N = eval(input())
3 list_T = eval(input())
4 n = len(list_N)
5 i = 0; Found = False
6 while (i < n and Found == False):
7     if Name == list_N[i]:
8         print(list_T[i])
9         Found == True
10    else: i = i + 1
11    if Found == False:
12        print("Sorry, name not in directory")
```

1 ops => executed once

Assume the name is **not** in the list!

Total number of executed operations

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Assume the name is **not** in the list!

Total number of executed operations

$$1 + 1 + 1 + 1 + 2 + (n + 1) + n + n + 1 + 1 = 3n + 9$$

Sequential search – Worst case behavior

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Assume the name is **the last one** in the list!

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Assume the name is **the last one** in the list!

$$1 + 1 + 1 + 1 + 2$$

Sequential search – Worst case behavior

1	Name = eval(input())	1 ops => executed once
2	list_N = eval(input())	1 ops => executed once
3	list_T = eval(input())	1 ops => executed once
4	n = len(list_N)	1 op => executed once
5	i = 0; Found = False	2 ops => executed once
6	while (i < n and Found == False)	1 op => (n + 1) reps
7	if Name = list_N[i]:	
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10	else: i = i + 1	1 op => (n-1) reps
11	if Found == False:	1 op => executed once
12	print("Sorry, name not in directory")	skipped...

Assume the name is **the last one** in the list!

$$1 + 1 + 1 + 1 + 2 + (n + 1) + n + 1 + 1 + (n - 1) + 1 = 3n + 9$$

What really matters

- 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.

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- Algorithm B takes already **twenty times** longer!

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The Order of Magnitude is a **formula** that **strips away all ballast**. For example. . .

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The “Big O notation”

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Formally, the Order of Magnitude is defined as:

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You are only interested into the **fastest growing part** of the function you have!

Beware of fast growth!

Imagine algorithms A, B, and C, with

- A in $O(n)$,
- B in $O(n^2)$, and
- C in $O(2^n)$

Consider an operation taking $\frac{1}{100}$ s

n	10
A	$\frac{1}{10}$ s
B	1 s
C	ca. 10 s

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Consider an operation taking $\frac{1}{100}$ s

n	10	20
A	$\frac{1}{10}$ s	$\frac{2}{10}$ s
B	1 s	4 s
C	ca. 10 s	ca. 3 h

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Consider an operation taking $\frac{1}{100}$ s

n	10	20	30
A	$\frac{1}{10}$ s	$\frac{2}{10}$ s	$\frac{3}{10}$ s
B	1 s	4 s	9 s
C	ca. 10 s	ca. 3 h	ca. 4 months

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Consider an operation taking $\frac{1}{100}$ s

n	10	20	30	40
A	$\frac{1}{10}$ s	$\frac{2}{10}$ s	$\frac{3}{10}$ s	$\frac{4}{10}$ s
B	1 s	4 s	9 s	16 s
C	ca. 10 s	ca. 3 h	ca. 4 months	ca. 348 years

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- Generally, algorithms in $O(n^x)$ for some x are called **polynomial** (constant, linear, quadratic, cubic, ...)
- Algorithms in $O(2^n)$ are called **exponential**

Summary

- We are concerned about the efficiency of algorithms
 - Time and space efficiency
 - An analysis of the algorithm is necessary
- The order of magnitude (Big O notation) measures efficiency
 - $O(1)$, $O(n)$, $O(n^2)$, ...
 - Measures the growth with increasing input size n
 - Aim for low growth rates