

COL106: Data Structures and Algorithms

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- How do Data Structures play a part in making computational tasks efficient?

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Example problem

Maintain a record of students and their scores on some test so that queries of the following nature may be answered:

- Insert: Insert a new record of a student and his/her score.
 - Search: Find the score of a given student.
-
- Suppose we maintain the information in a 2-dimensional array.
 - How much time does each insert operations take? $O(1)$
 - How much time does each search operation take? $O(n)$
 - So, if the majority of the operations performed are search operations, then this data structure is perhaps not the right one.

Introduction

- How do Data Structures play a part in making computational tasks efficient?

Example problem

Maintain a record of students and their scores on some test so that queries of the following nature may be answered:

- Insert: Insert a new record of a student and his/her score.
 - Search: Find the score of a given student.
-
- Suppose we maintain the information in a 2-dimensional array such that the array is sorted based on the names (dictionary order).
 - How much time does each insert operations take? $O(n)$
 - How much time does each search operation take? $O(\log n)$ using **Binary Search**
 - In this case, if the majority of the operations performed are insert operations, then the previous one is better.

Introduction

Digression: Binary Search

Problem

Given a sorted array A containing n integers and an integer x , check if x is present in A .

Introduction

Digression: Binary Search

Problem

Given a sorted array A containing n integers and an integer x , check if x is present in A .

Algorithm

BinarySearch-v1(x, A, n)

- If A has no elements, then return("not present")
- Let mid denote the *middle* index of the array (i.e., $mid = \lfloor n/2 \rfloor$)
- If ($A[mid] = x$), then return("present")
- Let A_L denote the *left-half* of the array and A_R denote the *right-half* of the array
- If ($x < A[mid]$)
 - Search x in A_L
- else
 - Search x in A_R

Introduction

Digression: Binary Search

Problem

Given a sorted array A containing n integers and an integer x , check if x is present in A .

Algorithm

`BinarySearch-v2(x, A, n)`

- If ($n \leq 0$), then return("not present")
- $mid \leftarrow \lfloor n/2 \rfloor$
- If ($A[mid] = x$), then return("present")
- $A_L \leftarrow A[1 \dots (mid - 1)]$
- $A_R \leftarrow A[(mid + 1) \dots n]$
- If ($x < A[mid]$)
 - Search x in A_L return(`BinarySearch-v2($x, A_L, mid - 1$)`)
- else
 - Search x in A_R return(`BinarySearch-v2($x, A_R, n - mid$)`)

Introduction

Digression: Binary Search

Problem

Given a sorted array A containing n integers and an integer x , check if x is present in A .

Algorithm

BinarySearch-v2(x, A, n)

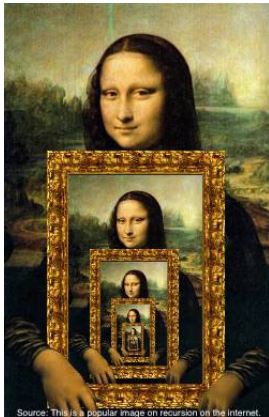
- If ($n \leq 0$), then return("not present")
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- $A_R \leftarrow A[(mid + 1) \dots n]$
- If ($x < A[mid]$)
 - Search x in A_L return(BinarySearch-v2($x, A_L, mid - 1$))
- else
 - Search x in A_R return(BinarySearch-v2($x, A_R, n - mid$))

- The above function calls marked in red are called *recursive* function calls.
- The function BinarySearch-v2 is called a *recursive function*.

Introduction

Digression: Binary Search → Recursive Functions

- Recursion: Self reference.



- In our context, we talk about recursive functions.

Introduction

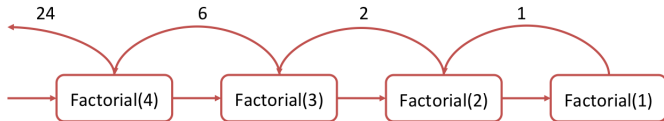
Digression: Binary Search → Recursive Functions

- Recursive function: A function that makes a call to itself.

Algorithm

`Factorial(n)`

- If ($n = 0$ or $n = 1$) return(1)
- $f \leftarrow \text{Factorial}(n - 1)$
- return($n \cdot f$)



Introduction

Digression: Binary Search → Recursive Functions

- Recursive function: A function that makes a call to itself.

Algorithm

Factorial(n)

- If ($n = 0$ or $n = 1$) return(1)
- $f \leftarrow$ Factorial($n - 1$)
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- Base case: Returns result for small value of inputs. Defines the recursion termination condition.
- Reduction step: Assuming that the function returns correct value for smaller inputs use function calls on smaller inputs to compute the result on the given input.

Introduction

Digression: Binary Search → Recursive Functions

- Question: How do we prove correctness of recursive functions?

Algorithm

Factorial(n)

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Digression: Binary Search → Recursive Functions

- Question: How do we prove correctness of recursive functions? **Induction**

Algorithm

Factorial(n)

- If ($n = 0$ or $n = 1$) return(1)
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Digression: Binary Search → Recursive Functions

- Question: How do we prove correctness of recursive functions? **Induction**
- Question: Is it always possible to avoid recursive functions?

Algorithm

Factorial(n)

- If ($n = 0$ or $n = 1$) return(1)
- $f \leftarrow$ Factorial($n - 1$)
- return($n \cdot f$)

Introduction

Digression: Binary Search → Recursive Functions

- Question: How do we prove correctness of recursive functions? **Induction**
- Question: Is it always possible to avoid recursive functions?
Yes.

Algorithm

Factorial-iterative(n)

- $f \leftarrow 1$
- for $i = 1$ to n
 - $f \leftarrow f \cdot i$
- return(f)

- In fact, there is some efficiency advantage in not using recursive functions.

Introduction

Digression: Binary Search → Recursive Functions

- Question: How do we prove correctness of recursive functions? **Induction**
- Question: Is it always possible to avoid recursive functions?
Yes.
- In fact, there is some efficiency advantage in not using recursive functions as function calls involve various time/space overheads.
- Why is recursion used then?

Introduction

Digression: Binary Search → Recursive Functions

- Question: How do we prove correctness of recursive functions? **Induction**
- Question: Is it always possible to avoid recursive functions?
Yes.
- In fact, there is some efficiency advantage in not using recursive functions as function calls involve various time/space overheads.
- Why is recursion used then?
 - In many cases, using recursion makes the program much simpler and easy to understand and analyse.
 - Many problems in Computer Science have inherent recursive structures (e.g., Fibonacci sequence)

Introduction

Digression: Binary Search → Recursive Functions → Fibonacci Sequence

- The Fibonacci sequence is defined in the following recursive manner:
 - Base case: $F(0) = 0, F(1) = 1$
 - For all $n > 1$, $F(n) = F(n-1) + F(n-2)$
- So, the sequence is:
 - $F(0) = 0$
 - $F(1) = 1$
 - $F(2) = F(1) + F(0) = 1 + 0 = 1$
 - $F(3) = F(2) + F(1) = 1 + 1 = 2$
 - $F(4) = F(3) + F(2) = 2 + 1 = 3$
 - \vdots

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Digression: Binary Search → Recursive Functions → Fibonacci Sequence

- The Fibonacci sequence is defined in the following recursive manner:
 - Base case: $F(0) = 0, F(1) = 1$
 - For all $n > 1, F(n) = F(n - 1) + F(n - 2)$
- So, the sequence is: 0, 1, 1, 2, 3, 5, 8, 13, ...
- The problem itself is defined in a recursive manner. So, it is natural to write a recursive method to solve this.

Algorithm

```
Recursive-Fib( $n$ )
```

```
  If ( $n = 0$  or  $n = 1$ )return( $n$ )
```

```
  - return(Recursive-Fib( $n - 1$ ) + Recursive-Fib( $n - 2$ ))
```

Introduction

Digression: Binary Search → Recursive Functions → Fibonacci Sequence

- The Fibonacci sequence is defined in the following recursive manner:
 - Base case: $F(0) = 0, F(1) = 1$
 - For all $n > 1, F(n) = F(n - 1) + F(n - 2)$
- So, the sequence is: 0, 1, 1, 2, 3, 5, 8, 13, ...
- The problem itself is defined in a recursive manner. So, it is natural to write a recursive method to solve this.

Algorithm

```
Rfib(n)
```

```
  If ( $n = 0$  or  $n = 1$ )return( $n$ )
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```
  - return(Rfib( $n - 1$ ) + Rfib( $n - 2$ ))
```

- How do we analyse the running time of the above algorithm?

Introduction

Digression: Binary Search → Recursive Functions → Fibonacci Sequence

Algorithm

$Rfib(n)$

If $(n = 0 \text{ or } n = 1)$ return (n)

- return $(Rfib(n - 1) + Rfib(n - 2))$

- How do we analyse the running time of the above algorithm?

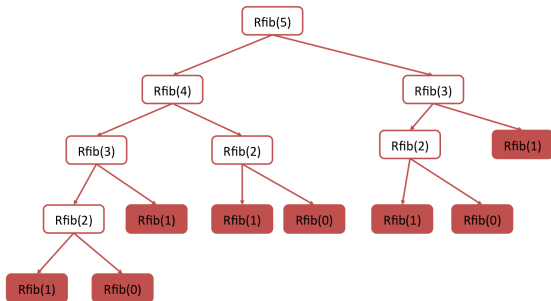


Figure : Recursive call tree for recursive fibonacci algorithm.

Introduction

Digression: Binary Search → Recursive Functions → Fibonacci Sequence

Algorithm

$\text{Rfib}(n)$

If $(n = 0 \text{ or } n = 1)$ return (n)

- return $(\text{Rfib}(n - 1) + \text{Rfib}(n - 2))$

- How do we analyse the running time of the above algorithm?
- Note that the same recursive call is made multiple times (e.g., $\text{Rfib}(2)$)

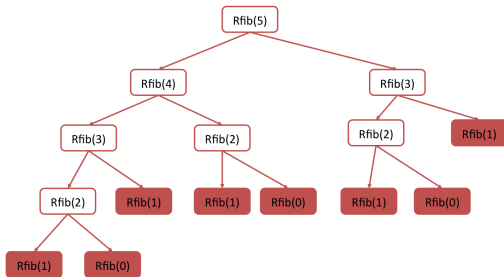


Figure : Recursive call tree for recursive fibonacci algorithm.

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Digression: Binary Search → Recursive Functions → Fibonacci Sequence

Algorithm

Rfib(n)

If ($n = 0$ or $n = 1$) return(n)

- return(Rfib($n - 1$) + Rfib($n - 2$))

- How do we analyse the running time of the above algorithm?
- Note that the same recursive call is made multiple times (e.g., Rfib(2))
- In general, there are a lot of redundant calls.
- The running time of the above recursive algorithm can in fact be shown to be $\Omega(2^{n/2})$.
- Question: Can we find the n^{th} fibonacci number much faster than this?

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Digression: Binary Search

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Given a sorted array A containing n integers and an integer x , check if x is present in A .

Algorithm

`BinarySearch(x, A, i, j)`

- if ($j < i$) return ("not present")
- $mid \leftarrow \lfloor \frac{i+j}{2} \rfloor$
- if ($A[mid] = x$) return ("present")
- if ($x < A[mid]$) return (`BinarySearch($x, A, i, mid - 1$)`)
- else return (`BinarySearch($x, A, mid + 1, j$)`)

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- How do we prove the correctness of above algorithm?

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- How do we prove the correctness of above algorithm?

Induction

- $P(i)$: The algorithm correctly searches any given element in any sorted array of size i .

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- How do we prove the correctness of above algorithm? **Induction**
- $P(i)$: The algorithm correctly searches any given element in any sorted array of size i .
- Is $P(1)$ true?

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- How do we prove the correctness of above algorithm? **Induction**
- $P(i)$: The algorithm correctly searches any given element in any sorted array of size i .
- Is $P(1)$ true?
- If $P(1), P(2), \dots, P(k)$ are true, then is $P(k + 1)$ also true?

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- What is the running time of the above algorithm in terms of the Big-O notation?

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- What is the running time of the above algorithm in terms of the Big-O notation?
- Let us denote $T(n)$ as the worst case running time for searching in sorted arrays of size n .
- Try writing a **recurrence-relation** for $T(n)$.

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- What is the running time of the above algorithm in terms of the Big-O notation?
- Let us denote $T(n)$ as the worst case running time for searching in sorted arrays of size n .
- $T(n) \leq T(\lfloor n/2 \rfloor) + c$ for all $n > 1$ and $T(1) = b$.
- How do we solve such recurrence relation?

End