

key notion:

Algorithm = well-specified procedure for

solving a computational problem

(Mathematical abstraction of Computer Program)

→ May be specified in English (preferred)

or pseudo-code, as long as it is precise

(Avoid using real code)

problem specifies desired output for each
 input



input

("Instances")

output

Sep 30, 2018

x = an integer

y = smallest prime $\geq x$

→ Difference between CS and math we care how y is computed

Want algorithms that are:

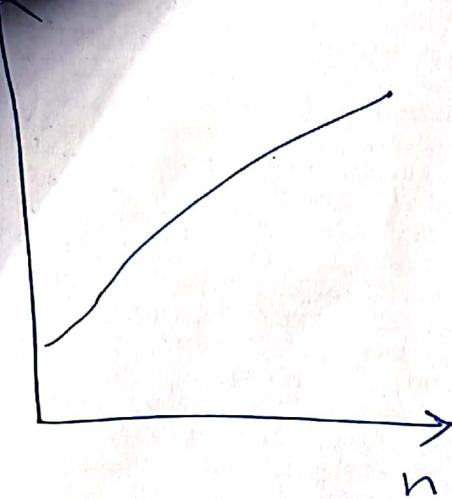
- Correct (obviously!)
 - fast \approx scalable
 - Simple
- } focus here

Scalability:

- Measure running time / space / etc as input size grows
- our focus = $T(n) =$ run time as function of input size n
 - need to be defined for each problem e.g. n for $n \times n$ matrix input

Sep 30, 2018

P. 3



- we care only about "big picture" here
 - Ignore minor details (machine instructions set, Compiler optimization ...)
 - Very Important idea*

Ignore constant factors and lower orders terms
 - key tools : Asymptotic analysis ($\Theta, \Omega, \Sigma, \mathcal{O}, \omega$)
- E.g. $5n^2 - 7n + 4 = \Theta(n^2)$

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$$T(n) = \Theta(\log n)$$

logarithmic

$$T(n) = \Theta(n)$$

linear

GREAT

$$T(n) = \Theta(n^2)$$

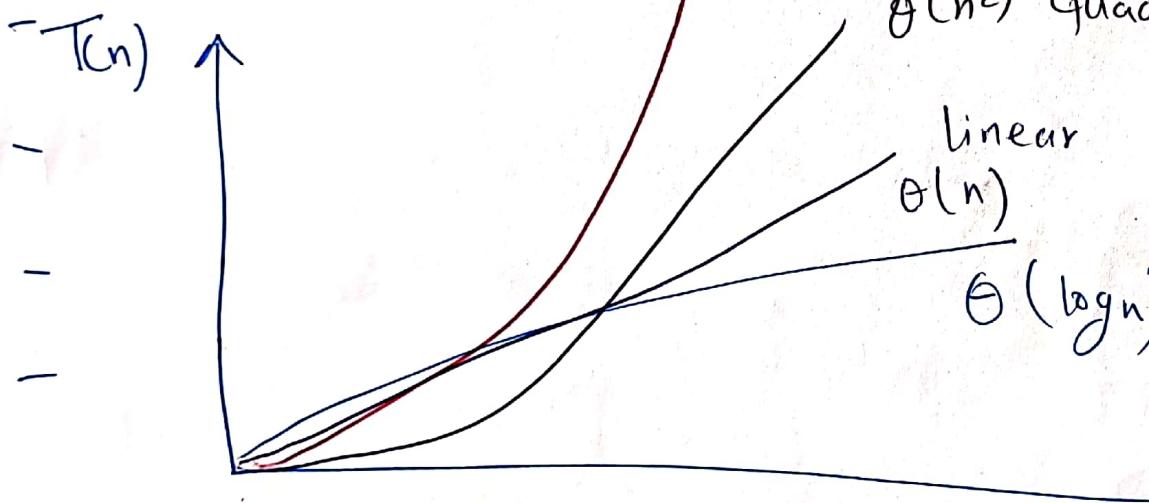
quadratic

OK

$$T(n) = \Theta(c^n)$$

exponential

BAD



→ our chief goal here =

Learn how to reason about correctness and efficiency of algorithms in precise and principle manner

(P 15)
Sep 30, 2018

Material overview:

- Sorting (one of the most basic problem)
- Data structures (organizing data to make it easy to access)
- Heaps
- Binary search trees
- Hashing
- graph search (how to explore graph)
- shortest path (how Google Maps works)
- iterative algorithms (optimization via repeated)
- Dynamic programming

Basic idea :

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Mathematical model of Computer. Mentally execute algorithm on model and evaluate time for every operation that an algorithm might perform.

- What is the time required on the model
- what input data

Q₁ : How does our model relate to real computer?
I will discuss some definition

Problem we give definition for it above let give ex

- Computing GCD greatest common divisor
- Finding shortest path on map
- Finding meaning of a word in dictionary
- Given X ray determine if there is disease

GCD of two number our Input consists of numbers 36, 48 the GCD be number 12

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Problem: Specification of what are valid input and what are acceptable output for each valid input

Input Instance: A value x is an input instance for problem P , if x is a valid input as per the specification

So 36, 48 constitute an instance for GCD

Another important term that we need is size of instance

Algorithm: An abstract computational procedure which takes some value or values as input and produces a value or values as output

program = Expression of Algorithm

Mathematical model that we are going to use in this course is called RAM: stands for random access machine. This is a very simplified computer model. Consist of two parts

1. Processors
2. Memory

- How to write Algorithm Pseudo code See convention
- frequency Count Method

Algorithm Sum (A, n)

{

S = 0

for ($\frac{i=0}{1}$; $\frac{i < n}{n+1}$, $\frac{i++}{n}$) - n + 1

{ S = S + A[i]; }

}

return S

}

// A is array
// n is size of element

A

8	3	9	7	2
0	1	2	3	4

n = 5

i = 0

i = 1

i = 2

i = 3

i = 4

i = 5 x stop

$$f(n) = 2n + 3 \text{ this time funct}$$

Assume assign each statement with unit f time
the degree is n so order $f(n)$

Space analysis

A \rightarrow n words

n \rightarrow 1

s \rightarrow 1

i \rightarrow 1

Space Complexity

$$S(n) = n + 3 \text{ is } O(n)$$

Oct 2, 2018 P. 9

Algorithm add (A, B, n) // A, B are square matrix

```

    {
        for (i = 0; i < n, i++) — n + 1
        {
            for (j = 0; j < n, j++) — n x (n + 1)
            {
                C[i, j] = A[i, j] + B[i, j], — nxn
            }
        }
    }

```

$$f(n) = 2n^2 + 2n + 1$$

$n \times n$ matrix 3×3

degree of n^2 so order of n^2 $O(n^2)$

Space complexity

A n^2 $n \times n$

B n^2

C n^2

n —

i — 1

j — 1

$$S(n) = 3n^2 + 3 \quad O(n^2)$$

Algorithm multiply (A, B, n)

{

for (i=0; i < n; i++) ————— n + 1

{

for (j = 0; j < n; j++) ————— n * (n+1)

{

C[i, j] = 0; ————— n * n

for (k = 0; k < n; k++) ————— n * n * (n+1)

{

C[i, j] = A[i, k] * B[k, j]; ————— n * n * n

{

{}

O(n³) order of cub

Space

A

n²

B

n²

C

n²

i

1

j

1

K

1

$$f(n) = 2n^3 + 3n^2 + 2n + 1$$

O(n³) Time

order of n²

`for(i=0; i<n, i++) n+1`

stat — n
 $\sum_{i=1}^n 1 = O(n)$

If Suppos

عنصری پر

`for (i=n; i>0, i--)`

stat — n
 $\sum_{i=n}^1 1 = O(n)$

If we change the loop

How to analyze one

`for(i=1 ; i<n, i=i+2)`

stat — $\frac{n}{2}$

} $\sum_{i=1}^{\frac{n}{2}} 1 = O(n)$

If change

`for(i=1; i<n; i=i+2)`

stat — $\frac{n}{2}$
 $\sum_{i=1}^{\frac{n}{2}} 1 = O(n)$

order $\frac{n}{2}$
of n

P. 12

```
for ( i=0 ; i<n , i++ ) n+1
```

```
    { for ( j = 0 ; j < n , j++ ) n+1
```

```
        { start }
```

```
    }
```

```
    }
```

n x n

$O(n^2)$

To solve to analyze

Another loop

```
for ( i=0 ; i<n , i++ )  
    {  
        for ( j = 0 ; j < i , j++ )  
            { start }
```

```
    }
```

```
    }
```

new = 1 2 3

1 + 2 + 3 + ... +

$$= \frac{n(n+1)}{2}$$
$$f(n) = \frac{n^2 + 1}{2}$$
$$f(n) = O(n^2)$$

P. 13

$P = 0$
for ($i = 1; i < n, i++$)
{ $P = P + i$
}

Trace

	P	
-	0	$0 + 1 = 1$
1	1	$1 + 2 = 3$
2	3	$1 + 2 + 3$
3	6	
4	10	
...		

$$1 + 2 + 3 + 4 + \dots + k \text{ times}$$

Assume $k \rightarrow n$

Since $P = \frac{k(k+1)}{2} \rightarrow n$

$$\frac{n(n+1)}{2} \rightarrow n$$

$n^2 \rightarrow n$

$$n = \sqrt{n}$$

this algorithm order ~ θ

$$\Theta(\sqrt{n})$$

for ($i=1$; $i < n$; $i = i * 2$)

{
start

Assume ' i ' became ' $i > n$ '

$$i = 2^K$$

$$2^K = n \rightarrow K = \log_2 n$$

$$\mathcal{O}(\log_2 n)$$

for ($i=1$; $i < n$; $i++$)

{
start

$$i = 1 + 1 + 1 + \dots = n$$

K

for ($i=1$, $i < n$, $i = i * 2$)

$$i = 1 \times 2 \times 2 \times \dots = n$$

$$2^K = n$$

 $K = \log_2 n$

$$\begin{array}{rcl} & 1 & \\ \frac{1}{1 \times 2} & = & 2 \\ 2 \times 2 & = & 4 \\ 4 \times 2 & = & 8 \end{array}$$

P-14

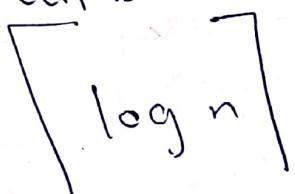
suppos $n = 8$ If take $n = 10$

Trace

i	
1	$i < 10$
2	
4	
8	
16	

$$\text{if find } \log_2 8 = 3 \quad \log_2^3 = 3 \frac{1}{\log_2 2}$$

$$\text{ceil value } \lceil \log_2 n \rceil = 3.2$$



another code

```
for (i=n, i>=1; i=i/2)
```

```
{ start
```

```
}
```

Assume $i < 1$

$$\frac{n}{2^k} < 1$$

$$\frac{n}{2^k} = 1$$

$$2^k = n$$

$$k = \log_2 n$$

$$O(\log_2 n)$$

Trace $\frac{n}{2^k}$ start

$$\frac{n}{2}$$

$$\frac{n}{2^2}$$

$$\vdots$$

$$\frac{n}{2^k}$$



$\text{for} (i=0; i < n; i++)$

start

terminal

$i_1 = 1$
 $i_2 = 2$
 $i_3 = 3$

so order $\theta(n^2)$

Ex
for ($i=0$; $i < n$; $i++$)

stmt

for ($j=0$; $j < n$; $j++$)
 stmt

Not nested

$O(n)$

$2n$

next one

$p = 0$
 $\text{for} (i=1; i < n; i=i+2)$
 $p++$
 for ($j=1; j < p; j=j+2$)
 stmt

Second loop is log p
where $p = \log n$
so loglog n

$\log(p) \rightarrow \log \log n$
 $O(\log \log n)$

What is p
in loop before

P. 16

$\text{for } (i=0; i < n, i++) \rightarrow n$
 $\text{for } (j=1; j < n, j = j+2) \rightarrow n \times \log n$
 { Stmt } $\rightarrow n \times \log n$
 } $\rightarrow 2n \log n + n$
 $O(n \log n)$

Summary

- $\text{for } (i=0, i < n, i++) \rightarrow O(n)$
- $\text{for } (i=0; i < n, i=i+2) \rightarrow \frac{n}{2} O(n)$
- $\text{for } (i=n; i > 1, i--) \rightarrow O(n)$
- $\text{for } (i=1; i < n, i=i \times 2) \rightarrow O(\log n)$
- $\text{for } (i=1; i < n, i=i \times 3) \rightarrow O(\log n_3)$
- $\text{for } (i=n, i > 1, i=i/2) \rightarrow O(\log n)$

Analysis while & if

while (Condition)

stmt;

ex

```
i = 0
{
    while (i <= n)
        {
            stmt;
            i++ i
        }
}
```

$$\underline{f(n) = 3n + 2 \Rightarrow O(n)}$$

ex

```
i = n
{
    while (i >= 1)
        {
            stmt;
            i = i / 2;
        }
}
```

ex

```
r = 1
k = 1
{
    while (k < n)
        {
            stmt
            k = k + i
            i++ i
        }
}
```

i	k
1	1
2	1+1 = 2
3	2+2 =
4	2+2+3
5	2+2+3+4

let m times

$$1 + 2 + 3 + 4 + \dots + m = \frac{m(m+1)}{2}$$

$k > n$ will stop

$$\frac{m(m+1)}{2} \geq n$$

$$\frac{m^2 + m}{2} \geq n \Rightarrow m = \sqrt{n}$$

$$O(\sqrt{n})$$

Trace
a

$$\begin{aligned} 1 \\ 1 \times 2 &= 2 \\ 2 \times 2 &= 4 \\ 4 \times 2 &= 8 \end{aligned}$$

k

a = 1
while (a < b)
 stmt
a = ax2

k

stopping when $a \geq b$

$$\cancel{k} \quad a = 2^k$$

$$2^k \geq b$$

$k = \log b$ replace b with n
 $O(\log^2 n)$

```
{ while (m != n)
```

```
    if (m > n)
```

```
    else m = m - n
```

```
    n = n - m
```

$$\frac{m}{3}$$

3

$$\frac{n}{3}$$

3

P. 19

$$\frac{m}{5}$$

$$\frac{n}{5}$$

$$\frac{m}{5}$$

$$14$$

$$12$$

$$10$$

$$8$$

$$6$$

$$4$$

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$T < \log n$ $< \sqrt{n} < n$
 To prove $\log n < \log \log n < \frac{n}{n^2} < \frac{n}{n^3} < \dots < \frac{1}{2^n} < \frac{1}{3^n} < \dots$
P. 20

log n	n	n^2	2^n
0	1	1	2
1	2	4	4
2	4	16	16
3	8	64	256
3.1	9	81	512