

①

13:15  
başlangıç

# ALGORITMA ANALİZİ

- Mine Elif KARSLIGİL -

## Kaynaklar

The Design & Analysis of Algorithm, A. Levitin

bas ucu kitabı gibi  
(hemen her temel  
konu var.)

Algorithms : 4th Edition, R. Sedgewick, K. Wayne

Princeton Uni.

The Algorithm Design Manual, S. Skiena

hocaları yazmış.  
(Hoca en çok bun-

dan yararlanıyor)

Hikaye kitabı gibi (Biraz Advanced)

## Değerlendirme

- 3 Ödev → %15

- Proje → %10

- 2 Midterm → %45

- Final → %30

② Ödevlerde kullanılacak programlama dili C (ödevde göre değişebilir.)

eleman sayısı  
elemanların veriliş sırası

- Best case

- Average case : en mantıklılık (ama hesabi zor)

- Worst case

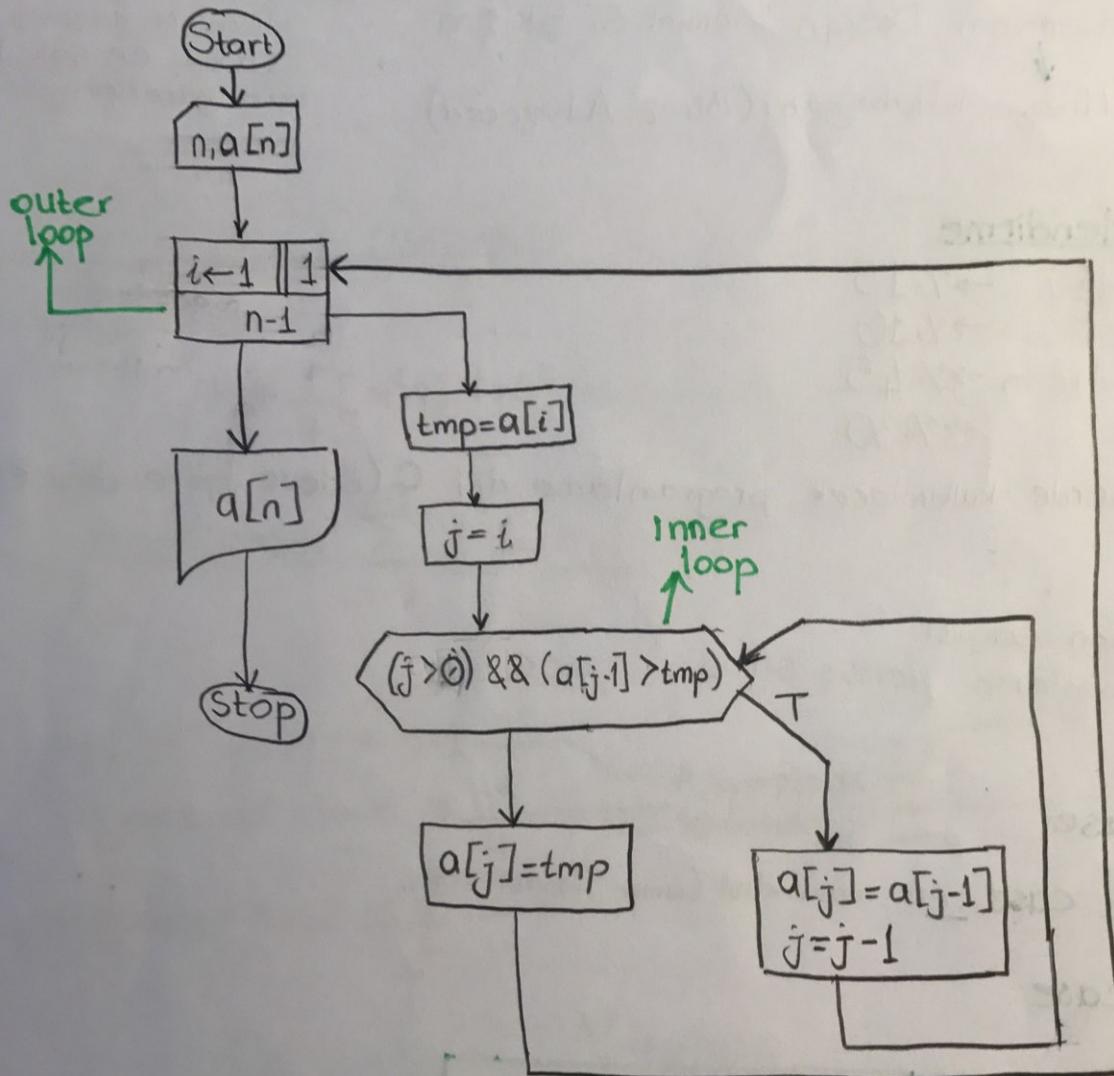
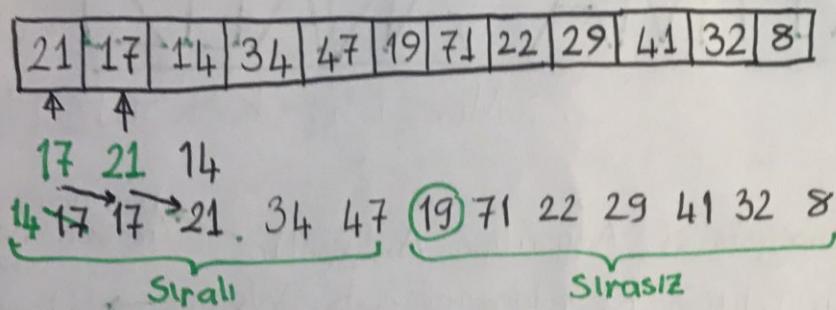
$$\sum_{i=1}^n i = 1+2+3+\dots+n = \frac{n.(n+1)}{2}$$

$$\sum_{i=1}^n i^2 = 1^2+2^2+3^2+\dots+n^2 = \frac{n.(n+1).(2n+1)}{6} = \frac{1}{3} n^3$$

$$\sum_{i=1}^n \lg i = n * \lg i$$

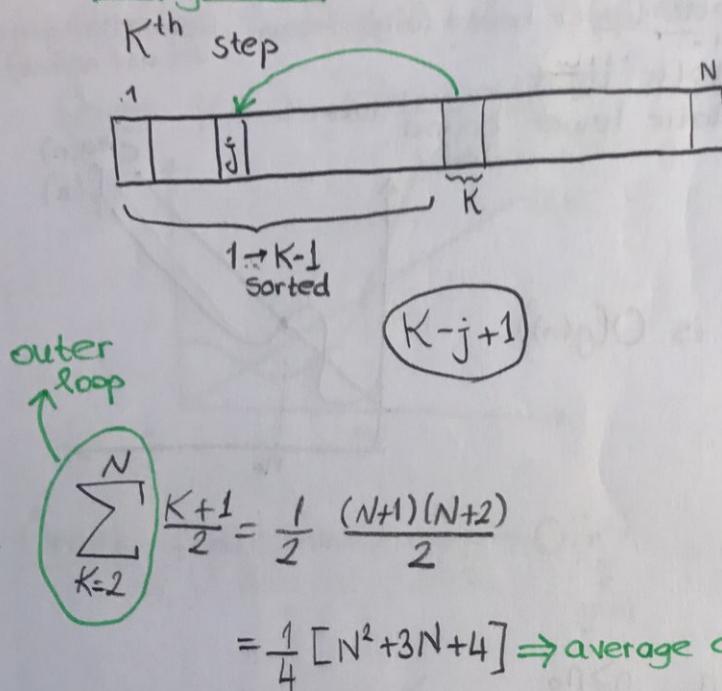


(2)

insertion sort

worst case: Outer loop :  $1 \dots n-1$   
 inner loop :  $j = 1, 2, 3, \dots, n-1$  }  $n-1$  }  $\rightarrow \sum_{i=1}^{n-1} \sum_{j=1}^{i-1} 1 = \sum_{j=1}^{n-1} i$   
 $= \frac{n * (n-1)}{2}$

(3)

Average case:

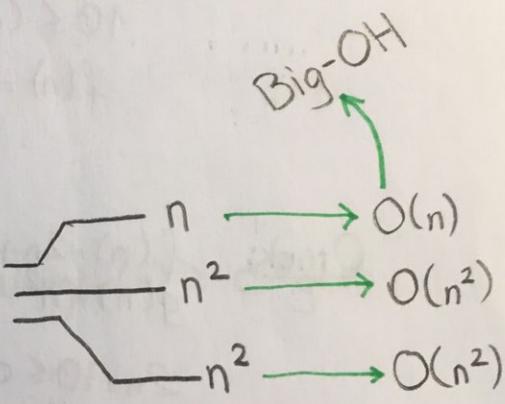
Best case:  $\sum_{i=1}^{n-1} 1 = \frac{n-1}{n} \approx n$

- Best case  $\approx n-1$
- Average case  $\approx \frac{n^2}{4}$  Asymptotic Notation
- Worst case  $\approx \frac{n^2}{2}$

inner loop

$$\frac{1}{K} \cdot \sum_{j=1}^K (K-j+1)$$
 $= \frac{1}{K} \left( K^2 - \frac{K(K+1)}{2} + K \right)$ 
 $= \frac{2K^2 - K^2 - K + 2K}{2K}$ 
 $\sim \frac{K+1}{2}$ 

Ortalama olarak K.gözdəki elemən tain iç döngüye girmə mikdəri

Asymptotic Notation

$$\boxed{\frac{N^2}{4} + \frac{3N}{4} + \frac{1}{2}} \xrightarrow[n \rightarrow \infty]{\text{sabitler elenir}} \frac{N^2}{4} + 3N + \cancel{X}$$

Katsayılar elenir.

$N^2$  Sonuç  $N^2 + \cancel{X}$  En yüksek dereceli terim alınır  $\frac{N^2}{4} + 3N$

Algoritmanın karmaşıklık mertebesi

(işletim sistemi, programlama dili, yazılım ve donanımdan bağımsız)



Scanned by Photo Scanner

4

### Asymptotic Notation

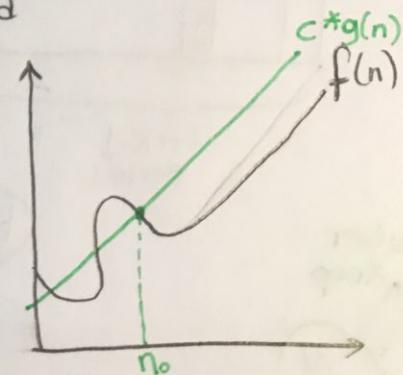
Big-Oh:  $O \rightarrow$  asymptotic upper bound (algoritmanın karmaşıklığında en üst nokta)

Big-theta:  $\Theta \rightarrow$  asymptotic tight

Big-omega:  $\Omega \rightarrow$  asymptotic lower bound

$$f(n) = 4n^2 + 2n$$

$$\left. \begin{array}{l} f(n) \leq c * g(n) \\ n > n_0 \text{ ve } c > 0 \end{array} \right\} f(n) \text{ is } O(g(n))$$



Örnek:  $f(n) = 2n + 10$   
 $g(n) = n$

$$\begin{aligned} 2n+10 &\leq c * n & n > n_0 \\ 10 &\leq (c-2) * n & c=3 \quad n=10 \end{aligned}$$

$$f(n) = 2n+10 \rightarrow O(n)$$

$g(n)$

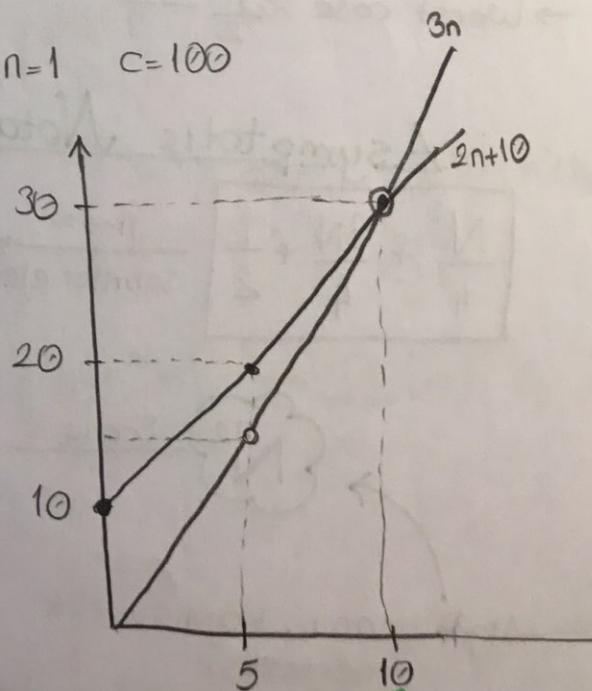
Örnek:  $f(n) = 2n + 10$   
 $g(n) = n^2$

$$2n+10 \leq c * n^2 \quad n > n_0, c > 0$$

$$cn^2 - 2n \geq 10 \quad n=1 \quad c=100$$

$$f(n) = O(g(n))$$

$$2n+10 = O(n^2)$$

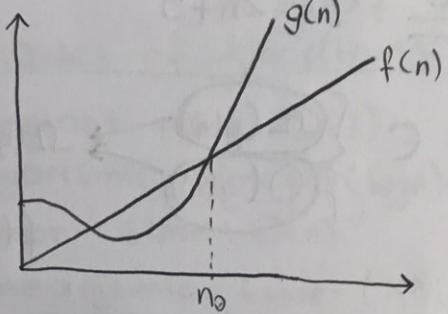


(5)

### Big-Oh Notation

$f(n) \in O(g(n))$  if  $0 \leq f(n) \leq c * g(n)$ ,  $n > n_0$ ,  $c > 0$

Örnek:  $f(n) = 2n + 10 \rightarrow O(n)$



$$2n + 10 \leq c * n \quad n > n_0$$

$$10 \leq (c-2)n \quad n_0 = 1$$

$$10 \leq c-2 \rightarrow 12 \leq c$$

Örnek:  $f(n) = 2n + 10 \rightarrow O(n^2)$

$$\downarrow g(n)$$

$$2n + 10 \leq c * n^2$$

$$16 \leq c * 9$$

$$n > n_0 > 0 \quad n=3$$

$$c=2, n=3$$

Örnek:  ~~$f(n^2) \in O(n)$~~

$$n^2 \leq c * n$$

$$n \leq c$$

### Big-Omega Notation

$f(n) \in \Omega(g(n))$  if  $c > 0$ ,  $n_0 > 0$ ,  $n > n_0 \rightarrow f(n) \geq c * g(n)$

asymptotic lower bound

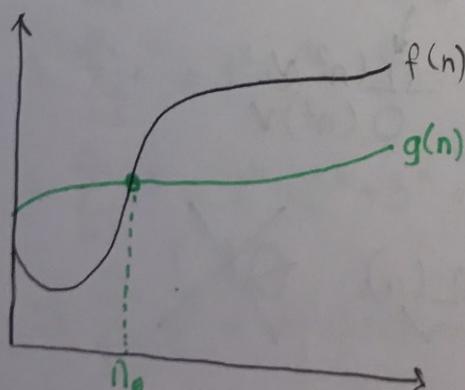
sequential search  $\rightarrow$  best case:  $\Omega(1)$

insertion sort  $\rightarrow$  best case:  $\Omega(n)$

Örnek:  $f(n) = 5n^2 \rightarrow \Omega(n^2)$

$$5n^2 \geq c * n^2, c > 0, n > n_0, n_0 > 0$$

$$(5-c)n^2 \geq 0 \quad n_0 = 1 \\ c = 1$$

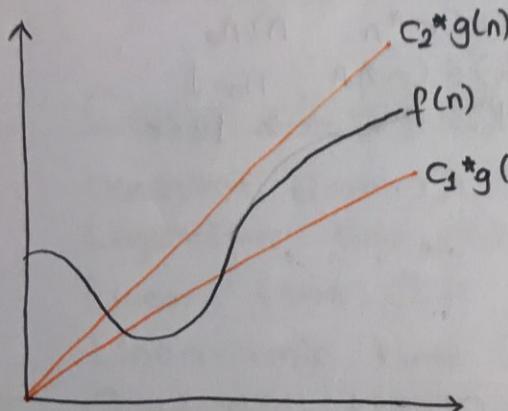


$$f(n) = 5n^2 \rightarrow \Omega(n) \quad ? \quad \checkmark$$

⑥

Big-theta ( $\Theta$ ) Notation: tight bound  $\rightarrow f(x)$  is asymptotically equal to  $g(x)$

$$c_1 \cdot g(n) \leq f(n) \leq c_2 \cdot g(n) \quad c_1 \leq c_2, n_0 > 0, n > n_0 \rightarrow f(n) = \Theta(g(n))$$



Örnek:  $f(n) = 2n + 5$

$$f(n) \in \left\{ \begin{array}{l} \Omega(g(n)) \\ O(g(n)) \end{array} \right\}$$

$$f(n) = 2n + 5 \xrightarrow{\times} \Theta(n^2)$$

$$f(n) \not\in \Omega(n^2)$$

$$f(n) \not\in O(1) \quad f(n) \not\in O(1)$$

$$f(n) \in \Theta(g(n))$$

Örnek:  $f(n) = 2n + 5 \in O(n)$

$$\textcircled{1} \quad 2n + 5 \in \Omega(n) \rightarrow 2n + 5 \geq c \cdot n \rightarrow 5 \geq (c-2) \cdot n \quad n_0 = 1, c = 3 \quad \checkmark$$

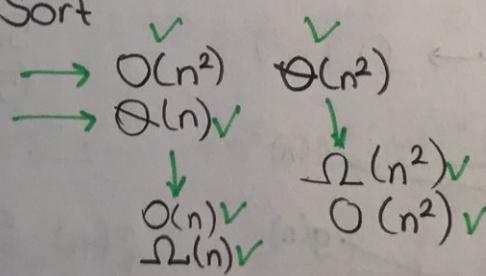
$$\textcircled{2} \quad 2n + 5 \in ? O(n) \rightarrow 2n + 5 \leq c \cdot n$$

$$5 \leq (c-2) \cdot n \quad n_0 = 1, c = 7 \quad \checkmark$$

$$c_1 = 3, c_2 = 7, n_0 = 1 \rightarrow [c_1 \cdot n \leq 2n + 5 \leq c_2 \cdot n] \rightarrow 2n + 5 \in \Theta(n)$$

Örnek: Insertion Sort

worst case  $\sim n^2$   
best case  $\sim n$



$$\text{Insertion Sort} \rightarrow O(n^2) \quad \Omega(n) \quad \Theta(\ )$$

(7)

Örnek: Merge SortBest case  $\sim n * \log n$   
Worst case  $\sim n * \log n$  $\rightarrow \Theta(n * \log n)$ Classes of AlgorithmsConstant time:  $O(1)$  $a = b + c$ Logarithmic time:  $O(\log n)$ 

binary search

Linear time:  $O(n)$ 

loop

Linearithmic time:  $(n * \log n)$ 

merge sort

Quadratic time:  $O(n^2)$ 

double loop

Cubic time:  $O(n^3)$ 

triple loop

Exponential time:  $O(2^n)$ 

exhaustive search

Useful Formulas for the Analysis of Algorithms- Property of Logarithms

1.  $\log x^y = y * \log x$
2.  $\log xy = \log x + \log y$
3.  $\log \frac{x}{y} = \log x - \log y$
4.  $\log_a x = \log_a b * \log_b x$
5.  $a^{\log_b x} = x^{\log_b a}$

- Combinatorics

1. Number of permutations of  $n$ -element set:  
 $P(n) = n!$
2. Number of  $k$ -combinations of  $n$ -element set:  
 $C(n, k) = \frac{n!}{k!(n-k)!}$
3. Number of subsets of an  $n$ -element set:  $2^k$

- Important Summation Formulas

1.  $\sum_{i=l}^u 1 = \underbrace{1+1+1+\dots+1}_{u-l+1} = u-l+1 \quad (l \leq u)$
2.  $\sum_{i=1}^n i = 1+2+3+\dots+n = \frac{n*(n+1)}{2} \approx \frac{1}{2} n^2$
3.  $\sum_{i=1}^n i^2 = 1^2+2^2+3^2+\dots+n^2 = \frac{n*(n+1)*(2n+1)}{6} \approx \frac{1}{3} n^3$
4.  $\sum_{i=1}^n i^k = 1^k+2^k+3^k+\dots+n^k \approx \frac{1}{k+1} * n^{k+1}$
5.  $\sum_{i=0}^n a^i = 1+a+a^2+\dots+a^n = \frac{a^{n+1}-1}{a-1} \quad (a \neq 1)$

$$\sum_{i=0}^n 2^i = 2^{n+1} - 1$$



(8)

$$6. \sum_{i=1}^n i \cdot 2^i = 1 \cdot 2 + 2 \cdot 2^2 + \dots + n \cdot 2^n = (n-1) \cdot 2^{n+1} + 2$$

$$7. \sum_{i=1}^n \frac{1}{i} = 1 + \frac{1}{2} + \frac{1}{3} + \dots + \frac{1}{n} \approx \ln n + \gamma \quad (\gamma \approx 0.5772)$$

$$8. \sum_{i=1}^n \lg i \approx n \cdot \lg n$$

### - Sum Manipulation Rules

$$1. \sum_{i=l}^u c \cdot a_i = c \cdot \sum_{i=l}^u a_i$$

$$2. \sum_{i=l}^u (a_i + b_i) = \sum_{i=l}^u a_i + \sum_{i=l}^u b_i$$

$$3. \sum_{i=l}^u a_i = \sum_{i=l}^m a_i + \sum_{i=(m+1)}^u a_i \text{ where } (l \leq m \leq u)$$

### - Floor and Ceiling Formulas

$$\lfloor 3.8 \rfloor = 3$$

$$1. x-1 < \lfloor x \rfloor \leq x \leq \lceil x \rceil < x+1$$

$$\lfloor -3.8 \rfloor = -4$$

$$2. \lfloor x+n \rfloor = \lfloor x \rfloor + n \text{ and } \lceil x+n \rceil = \lceil x \rceil + n$$

$$\lceil 3.8 \rceil = 4$$

(for real  $x$  and integer  $n$ )

$$\lceil -3.8 \rceil = -3$$

$$3. \lfloor n/2 \rfloor + \lceil n/2 \rceil = n$$

$$4. \lceil \lg(n+1) \rceil = \lfloor \lg n \rfloor + 1$$

### Mathematical Analysis of Nonrecursive Algorithms

Örnek:

START

$N, A[N]$

$\max = A[0]$

$I \leftarrow 1 \parallel 1$

$N-1$

$\max$

STOP

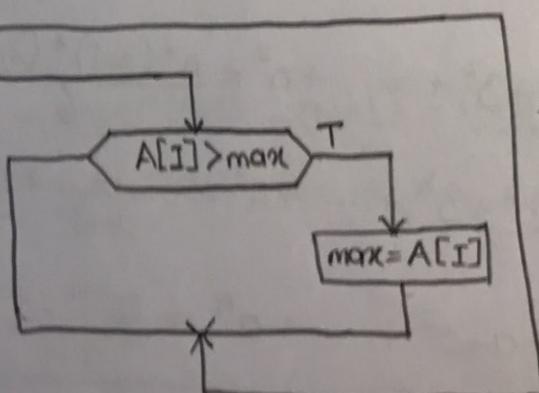
Two operations :

$A[I] > \max$

$\max = A[I]$

Basic operation  
Günlük if kontrolü her zaman yapılıyor, atama bozun oluyor.

0	1	2	3	4	5	6	7
7	1	3	2	8	4	6	5



$C(n)$ : the number of times this comparison is executed.

$$C(n) = \sum_{i=1}^{n-1} 1 = n-1 \quad \Theta(n)$$



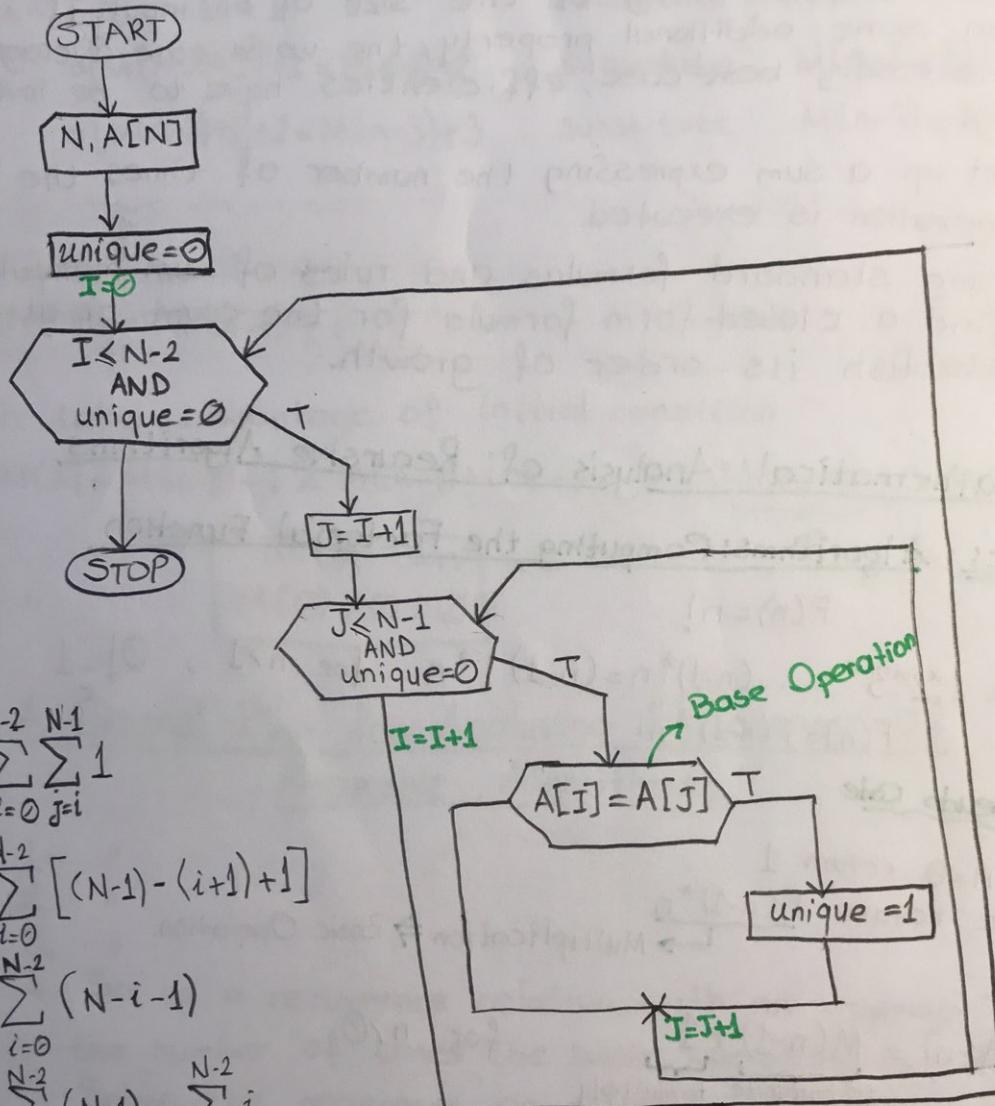
9

## Örnek: Algorithms: Element Uniqueness Problem

3	5	7	3	1	2	4
---	---	---	---	---	---	---

2	7	1	3	4	6	5
---	---	---	---	---	---	---

unique



$$C_{\text{worst}} = \sum_{i=0}^{N-2} \sum_{j=i}^{N-1} 1$$

$$= \sum_{i=0}^{N-2} [(N-1) - (i+1) + 1]$$

$$= \sum_{i=0}^{N-2} (N-i-1)$$

$$= \sum_{i=0}^{N-2} (N-1) - \sum_{i=0}^{N-2} i$$

$$= (N-1) * \sum_{i=0}^{N-2} 1 - \frac{(N-2)*(N-1)}{2} = (N-1)^2 - \frac{(N-2)*(N-1)}{2} = \frac{N*(N-1)}{2}$$

$$\approx \frac{1}{2} N^2 \in \mathcal{O}(N^2)$$

10

## General Plan for Analyzing of Non-recursive Algorithms

1. Decide on a parameter (or parameters) indicating on input's size.
2. Identify the algorithm's basic operation (As a rule, it is located in its innermost loop)
3. Check whether the number of times the basic operation is executed depends only on the size of an input. If it also depends on some additional property, the worst-case, average-case and if necessary best-case, efficiencies have to be investigated separately.
4. Set up a sum expressing the number of times the algorithm's basic operation is executed.
5. Using standard formulas and rules of sum manipulation, either find a closed-form formula for the count or, at the very least, establish its order of growth.

## Mathematical Analysis of Recursive Algorithms

### Example: Algorithms: Computing the Factorial Function

$$F(n) = n!$$

$$n! = 1 * 2 * 3 * \dots * (n-1) * n = (n-1)! * n \quad \text{for } n > 1, \quad 0! = 1$$

$$F(n) = F(n-1) * n!$$

#### Pseudo Code

```
if n=0 return 1  
else return F(n-1) * n
```

Multiplication  $\Rightarrow$  Basic Operation

$$M(n) = M(n-1) + 1 \quad \text{for } n > 0$$

to compute      to multiply  
 $F(n-1)$        $F(n-1)$  by  $n$

#### → Recurrences Relations ←

-Initial Condition: It tells us the the values with which the sequence starts. We can obtain this value by inspecting the condition that makes the algorithm stop its recursive calls.

if  $n=0$  return 1

$M(0) = 0$       → no multiplication  
the calls stop when  $n=0$       when  $n=0$



Recurrence Relation:

$$M(n) = M(n-1) + 1 \quad \text{for } n > 0$$

$$M(0) = \emptyset$$

Method of Backward Substitution

$$\begin{aligned} M(n) &= M(n-1) + 1 \\ &= [M(n-2) + 1] + 1 = M(n-2) + 2 \\ &= [M(n-3) + 1] + 2 = M(n-3) + 3 \\ &\vdots \end{aligned}$$

$$\begin{aligned} &\text{substitute } M(n-1) = M(n-2) + 1 \\ &\text{substitute } M(n-2) = M(n-3) + 1 \\ &\text{substitute } M(n-3) = M(n-4) + 1 \end{aligned}$$

$$M(n) = M(n-i) + i$$

To take advantage of initial condition

$$M(n) = M(n-1) + 1 = M(n-i) + i = \dots = M(n-n) + n = n$$

$\underbrace{\phantom{M(n-i) + i}}_{\emptyset}$

$n = \emptyset, i = n$   
 $M(\emptyset) + \emptyset = \emptyset$

A General Plan for Analyzing Efficiency of Recursive Algorithms

1. "
2. "
3. "
4. Set up a recurrence relation, with an appropriate initial condition, for the number of times the basic operation is executed.
5. Solve the recurrence or at least ascertain the order of growth of its solution.

(12)

Example:

Input: A positive decimal integer  
↳ The number of binary digits in binary's representation.

if  $n=1$  return 1  
else return BinaryDigit  $\lfloor n/2 \rfloor + 1$

$A(n)$ : The number of Additions

$$A(n) = A(\lfloor n/2 \rfloor) + 1$$

Initial condition:

$$n=1 \quad A(1)=\emptyset$$

$$n=2^k$$

$$A(2^k) = A(2^{k-1}) + 1$$

$$A(2^0) = \emptyset$$

Backward Substitution:

$$\begin{aligned} A(2^k) &= A(2^{k-1}) + 1 && \text{substitute } A(2^{k-1}) = A(2^{k-2}) + 1 \\ &= [A(2^{k-2}) + 1] + 1 && \text{substitute } A(2^{k-2}) = A(2^{k-3}) + 1 \\ &= [A(2^{k-3}) + 1] + 2 && \end{aligned}$$

$$\begin{aligned} &\qquad\qquad\qquad = A(2^{k-2}) + 2 \\ &\qquad\qquad\qquad = A(2^{k-3}) + 3 \\ &\qquad\qquad\qquad = A(2^{k-i}) + i \end{aligned}$$

$$= A(2^{k-k}) + k$$

$$= A(2^0) + k$$

$$\underline{\underline{0}}$$

$$= \frac{k}{1}$$

$$n=2^k \Rightarrow k=\log_2 n$$

$$A(n) = \log_2 n \in \Theta(\log n)$$



## Binary Search Algorithm

Input :  $A[0, \dots, n-1]$

Output : Index or -1

### Pseudo Code:

```

 $l \leftarrow 0, r \leftarrow n-1$ 
while ( $L \leq r$ ) do
     $m \leftarrow \lfloor (l+r)/2 \rfloor$ 
    if  $K = A[m]$  return  $m$ ;
    else if  $K < A[m]$   $r \leftarrow m-1$ 
    else  $l \leftarrow m+1$ 
return -1;

```

index	0	1	2	3	4	5	6	7	8	9	10	11	12
value	3	14	27	31	39	42	55	70	74	81	85	93	98
iteration1	$l$						$m$						$r$
iteration2								$l$		$m$			$r$
iteration3								$l$	$r$				

Search value = 70

$$C_w(n) = C_w(\lfloor n/2 \rfloor) + 1, \text{ for } n > 1$$

### Initial Condition

$$\underline{\underline{C_w(1) = 1}} \quad \underline{\underline{n=2^k}}$$

### Backward Substitution

$$C_w(2^k) = k+1 = \log_2 n + 1$$

(14)

Verify by Substitution that function  $C_w(n) = \lfloor \log_2 n \rfloor + 1$

indeed satisfies equation .... for any positive even number

$$n = 2i, i > 0$$

$$\begin{aligned} C_w(n) &= \lfloor \log_2 n \rfloor + 1 = \lfloor \log_2 2i \rfloor + 1 = \lfloor \log_2 2 + \log_2 i \rfloor + 1 \\ &= (1 + \lfloor \log_2 i \rfloor) + 1 = \lfloor \log_2 i \rfloor + 2 \end{aligned}$$

$$\begin{aligned} C_w(\lfloor n/2 \rfloor) + 1 &= C_w(\lfloor 2i/2 \rfloor) + 1 = C_w(i) + 1 \\ &= (\lfloor \log_2 i \rfloor + 1) + 1 = \lfloor \log_2 i \rfloor + 2 \end{aligned}$$

The worst-case efficiency of Binary Search  $\Theta(\log n)$

$$C_{avg}(n) \approx \log_2 n \rightarrow C_{avg}^{\text{yes}}(n) \approx \log_2 n - 1$$

$$C_{avg}^{\text{no}}(n) \approx \log_2(n+1)$$

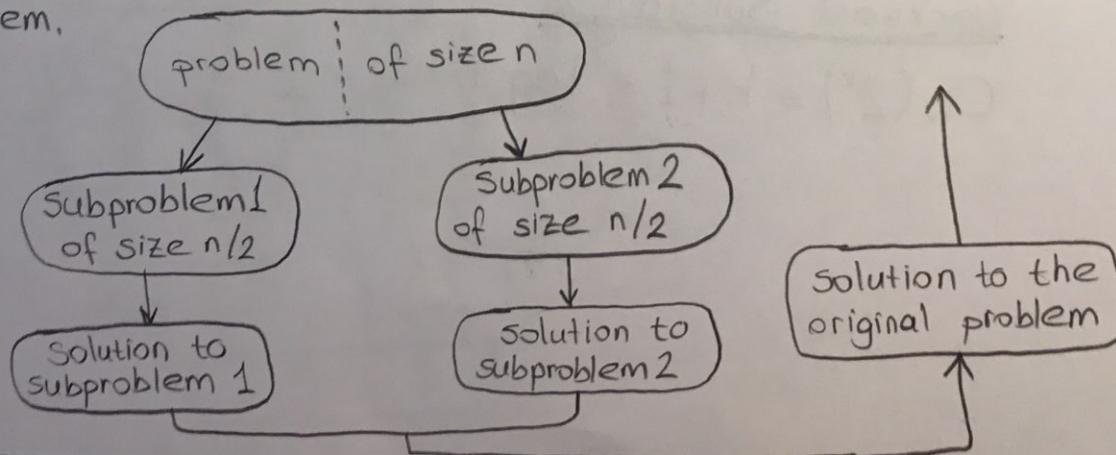
$$\lfloor \log_2 10^3 \rfloor + 1 = 10$$

$$\lfloor \log_2 10^6 \rfloor + 1 = 20$$

### Divide and Conquer Algorithms

They work according to the following general plan

1. A problem's instance is divided into several smaller instances of the same problem, ideally about same size.
2. The smaller instances are solved (typically recursively though sometimes a different algorithm is employed when instances become small enough.)
3. If necessary, the solutions obtained for the smaller instances are combined to get a solution to the original problem.



Computing the sum of  $n$

$$a_0 + a_1 + \dots + a_{n-1} = (a_0 + \dots + a_{\lfloor n/2 \rfloor - 1}) + (a_{\lfloor n/2 \rfloor + 1} + \dots + a_{n-1})$$

Instance size:  $n$

Subproblems:  $b$

the subproblems that need to be solved:  $a$

[General Divide-and-Conquer Recurrence]

$$T(n) = a T(n/b) + f(n) \rightarrow \text{Running Time}$$

$f(n)$  is a function that accounts for the time spent on dividing the problem into smaller ones and combining their solutions

## MASTER THEOREM

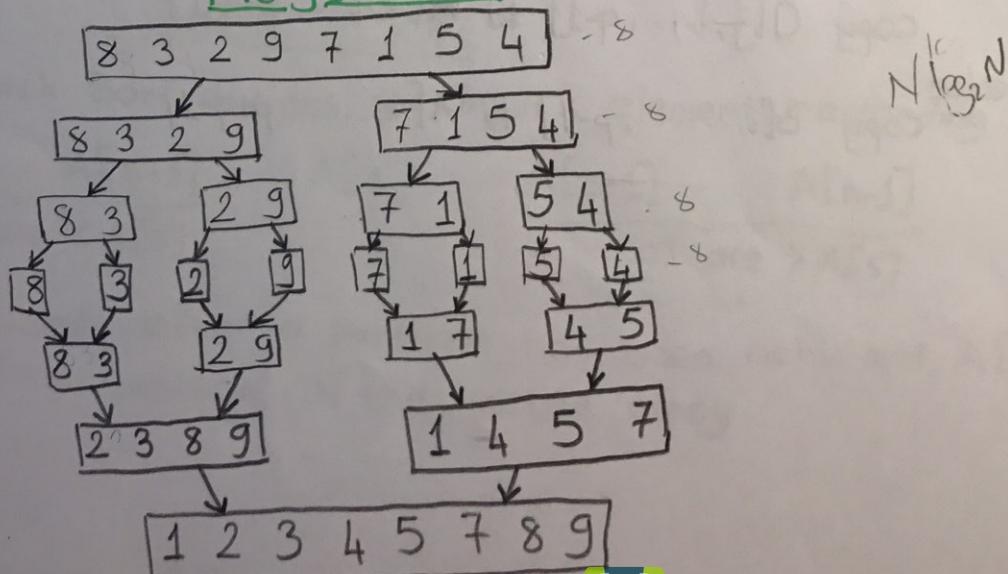
If  $f(n) \in \Theta(n^d)$  where  $d \geq 0$

$$T(n) \in \begin{cases} \Theta(n^d) & \text{if } a < b^d \\ \Theta(n^d \log n) & \text{if } a = b^d \\ \Theta(n^{\log_b a}) & \text{if } a > b^d \end{cases}$$

Example:  $A(n) = 2A(n/2) + 1$  if  $n > 1$

$$\begin{aligned} a &= 2 \\ b &= 2 \\ d &= 0 \end{aligned} \xrightarrow{\text{n'e ba\u0111li degil}} A(n) \in \Theta(n^{\log_2 2}) = \Theta(n)$$

### Merge Sort



(16)

### Pseudo Code

Mergesort( $A[0, \dots, n-1]$ )

if ( $n > 1$ )

copy  $A[0, \dots, \lfloor n/2 \rfloor + 1]$  to  $B[\emptyset, \dots, \lfloor n/2 \rfloor + 1]$

copy  $A[\lfloor n/2 \rfloor + 1, \dots, n-1]$  to  $C[\emptyset, \dots, \lfloor n/2 \rfloor - 1]$

Mergesort( $B[\emptyset, \dots, \lfloor n/2 \rfloor + 1]$ )

Mergesort( $C[\emptyset, \dots, \lfloor n/2 \rfloor - 1]$ )

Merge( $B, C, A$ )

$$C(n) = 2C(n/2) + C_{\text{merge}}(n) \quad n > 1$$

- 4. hafta / 18.10.2018

### Initial Condition

$C(1) = \emptyset$

Merge( $B[0, \dots, p-1]$ ,  $C[0, \dots, q-1]$ ,  $A[0, \dots, p+q+1]$ )

$i \leftarrow 0, j \leftarrow 0, k \leftarrow 0$

while  $i < p$  and  $j < q$  do

if  $B[i] \leq C[j]$

$A[k] \leftarrow B[i], i \leftarrow i+1$

else

$A[k] \leftarrow C[j], j \leftarrow j+1$

$k \leftarrow k+1$

if  $i = p$

copy  $C[j, \dots, q-1]$  to  $A[k, \dots, p+q-1]$

else

copy  $B[i, \dots, p-1]$  to  $A[k, \dots, p+q-1]$



- Recurrence Relation -

$$C(n) = 2C(n/2) + C_{\text{merge}}(n) \quad \text{for } n > 1$$

$$C_{\text{merge}}(n) = n-1$$

$$\text{Initial Condition: } C(1) = 0$$

$$C_{\text{worst}}(n) = 2C_{\text{worst}}(n/2) + n-1$$

- Backward Substitution -

$$C(n/2) = 2C(n/4) + n/2$$

$$C_{\text{worst}}(n) = 2[2C(n/4) + n/2] + n$$

$$= 4C(n/4) + n + n$$

$$= 4C(n/4) + 2n$$

$$= 8C(n/8) + 3n$$

$$= 2^i C(n/2^i) + i * n \quad \begin{matrix} \rightarrow n = 2^i \\ i = \log_2 n \end{matrix}$$

$$= nC(1) + \log_2 n * n$$

$$= \boxed{n * \log_2 n}$$

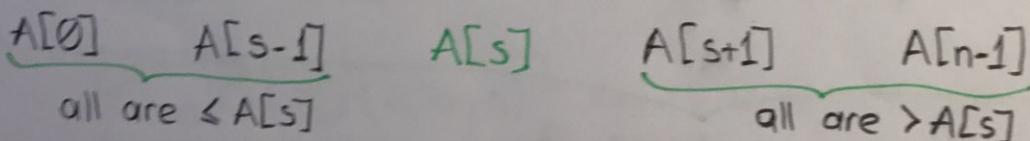
space complexity si  
digerlerine göre çok  
yüksek.

$$C_{\text{worst}}(n) \in \Theta(n \log n)$$

Principal Shortcoming: Linear amount of extra storage.

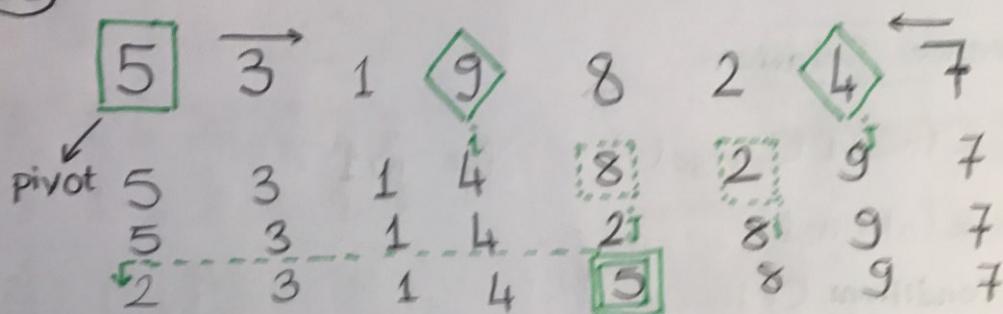
## Quick Sort

Quick Sort divides the input's elements according to their value.



Obviously after a partition has been achieved,  $A[s]$  will be in its final position in the sorted array

(18)



(a short example  
(whole example on p.19))

### Algorithms:

```

if  $l < r$ 
     $S \leftarrow \text{Partition}(A[l, \dots, r])$ 
    Quicksort( $A[l, \dots, s-1]$ )
    Quicksort( $A[s+1, \dots, r]$ )
  
```

- ① Steps on encountering the first element greater than OR equal to the pivot : left-to-right scan
- ② Steps on encountering the first element smaller than OR equal to the pivot : right-to-left scan

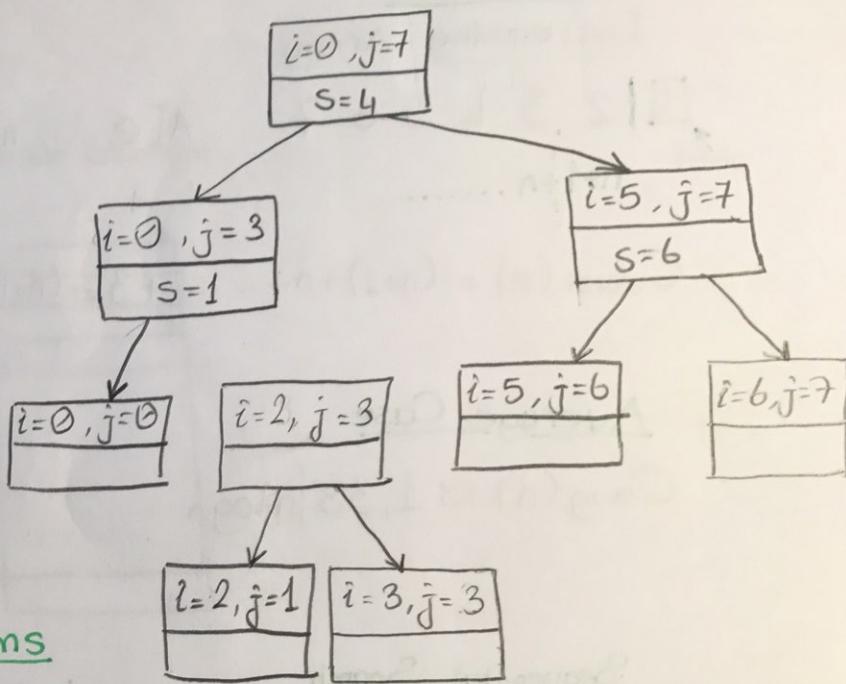
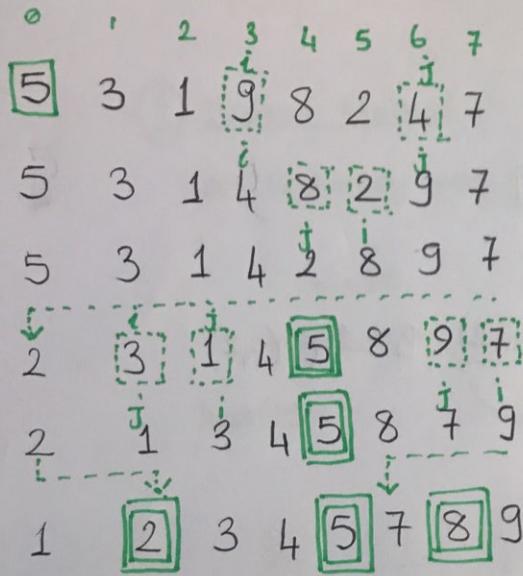
### Situations:

- 1 If scanning indices  $i$  and  $j$  have not crossed e.g.  $i < j$  we simply exchange  $A[i]$  and  $A[j]$  and resume the scans by incrementing  $i$  and decrementing  $j$  repeatedly.
- 2 If the scanning indices have crossed over i.e.  $i > j$  we have partitioned the array after exchanging the pivot with  $A[j]$
- 3 If the searching indices stop while pointing to the same element i.e.  $i = j$  the value they are pointing to must be equal

Combine 2 and 3

Exchange  $A[j]$  with pivot whenever  $i > j$

(19)



### Partition Algorithms

$p \leftarrow A[l]$

$i \leftarrow l, j \leftarrow r+1$

repeat

repeat  $i \leftarrow i+1$  until  $A[i] \geq p$

repeat  $j \leftarrow j-1$  until  $A[j] \leq p$

Swap ( $A[i], A[j]$ )

until  $i \geq j$

Swap ( $A[i], A[j]$ ) //undo least swap when  $i > j$

swap ( $A[l], A[j]$ )

### Best Case

If all the splits happen in the middle of corresponding subarrays, we will have the best case.

### Recurrence Relation

$$C_{\text{best}}(n) = 2C_{\text{best}}(n/2) + n$$

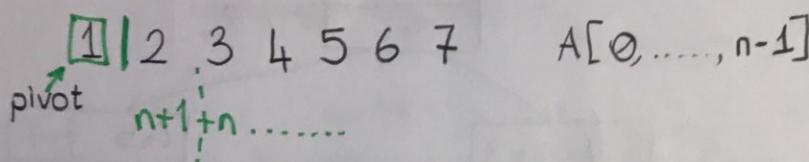
$$C_{\text{best}}(1) = 0$$

$$C_{\text{best}}(n) = \Theta(n \log n)$$

20

### Worst-Case

#### Increasing Array

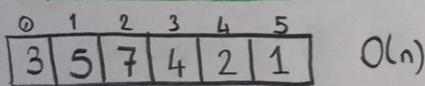


$$C_{\text{worst}}(n) = (n+1) + n + \dots + 3 = \frac{(n+1)*(n+2)}{2} - 3 \Rightarrow \Theta(n^2)$$

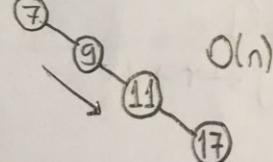
### Average Case

$$C_{\text{avg}}(n) \approx 1.38 n \log n$$

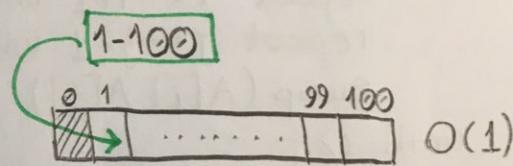
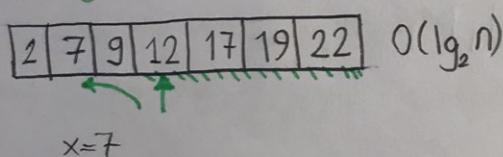
### Sequential Search



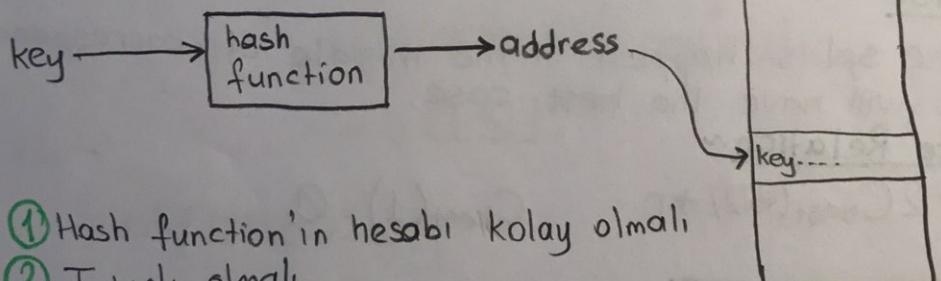
### BST



### Binary Search



### Hashing



- ① Hash function'in hesabi kolay olmalı
- ② Tutarlı olmalı
- ③ Adresin olabildiğince uniform dağılması sağlanmalı

key mod  $m$   
↑ tablo uzunluğu

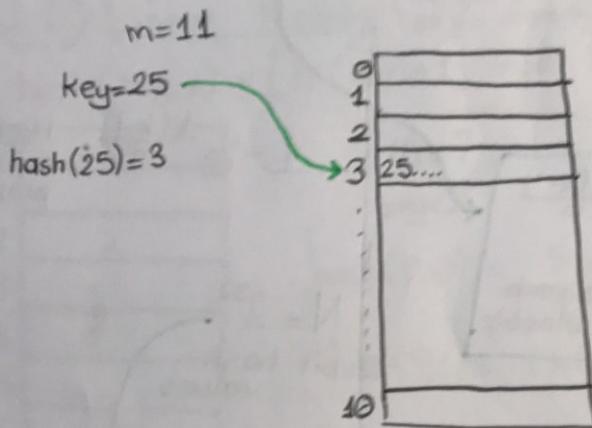
$m = 10 \rightarrow 2^\alpha$   
key  $\rightarrow 1000, 10, 40, 50$

★  $m$ 'in asal sayı olması performansı artırır.

## ① Division Method

$$\text{hash(key)} = \text{key} \bmod m$$

tablo uzunluğu



## ② Multiplication Method

A: constant  $0 < A < 1$

$$A = \frac{\sqrt{5}-1}{2} = 0,618033$$

$$\text{hash(key)} = \lfloor m * [(key * A) \bmod 1] \rfloor$$

$$(key * A) \bmod 1 = key * A - \lfloor key * A \rfloor$$

tablo  
uzunluğu

$$m=10.000 \quad k=123456$$

$$\begin{aligned} \text{hash}(123456) &= \lfloor 10.000 * (\underbrace{123456 * 0,618033}_{763.000,004151} \bmod 1) \rfloor \\ &= \lfloor 10.000 * 0,004151 \rfloor \\ &= \lfloor 41,51 \rfloor \end{aligned}$$

$$\text{hash}(123456) = 41$$

address

(22)

## Birthday Paradox

$$365 \rightarrow \frac{365-1}{365} * \frac{365-2}{365} * \dots * \frac{365-(k-1)}{365}$$

3 kişinin doğum günü farklı

table size: m

$$\frac{m-1}{m} * \frac{m-2}{m} * \dots * \frac{m-(k-1)}{m} \sim e^{-\frac{k(k-1)}{m}}$$

m tablo uzunlığında çakışma olasılığı

$$1 - e^{-\frac{k(k-1)}{m}} : \text{Hash collision probability}$$

$$N = 2^{32}$$

32-bit hash values

## Key

- ① Integer
- ② Floating number
- ③ String

ikisi farklı  
değer  
döndürmeli  
"ELMA"  
"MALE"

→ Horner's Method:

$$\text{key} = R^{L-1} * \text{str}[0] + \dots + R^0 * \text{str}[L-1]$$

31 (olarak) length of String Seçilir

Büyük harf ise:  
 $\text{str}[0] - 'A' + 1$

- ④ Compound key

31.08.1997

$$\hookrightarrow 31 * R + 8 * R^2 + 1997 * R^3$$

31

77163 insert %50

250.000 insert %100

birim/1. saatteki hiz

1. saatteki hiz

2. saatteki hiz

3. saatteki hiz

4. saatteki hiz

5. saatteki hiz

6. saatteki hiz

7. saatteki hiz

8. saatteki hiz

9. saatteki hiz

10. saatteki hiz

11. saatteki hiz

12. saatteki hiz

13. saatteki hiz

14. saatteki hiz

15. saatteki hiz

16. saatteki hiz

17. saatteki hiz

18. saatteki hiz

19. saatteki hiz

20. saatteki hiz

21. saatteki hiz

22. saatteki hiz

23. saatteki hiz

24. saatteki hiz

25. saatteki hiz

26. saatteki hiz

27. saatteki hiz

28. saatteki hiz

29. saatteki hiz

30. saatteki hiz

31. saatteki hiz

32. saatteki hiz

33. saatteki hiz

34. saatteki hiz

35. saatteki hiz

36. saatteki hiz

37. saatteki hiz

38. saatteki hiz

39. saatteki hiz

40. saatteki hiz

41. saatteki hiz

42. saatteki hiz

43. saatteki hiz

44. saatteki hiz

45. saatteki hiz

46. saatteki hiz

47. saatteki hiz

48. saatteki hiz

49. saatteki hiz

50. saatteki hiz

51. saatteki hiz

52. saatteki hiz

53. saatteki hiz

54. saatteki hiz

55. saatteki hiz

56. saatteki hiz

57. saatteki hiz

58. saatteki hiz

59. saatteki hiz

60. saatteki hiz

61. saatteki hiz

62. saatteki hiz

63. saatteki hiz

64. saatteki hiz

65. saatteki hiz

66. saatteki hiz

67. saatteki hiz

68. saatteki hiz

69. saatteki hiz

70. saatteki hiz

71. saatteki hiz

72. saatteki hiz

73. saatteki hiz

74. saatteki hiz

75. saatteki hiz

76. saatteki hiz

77. saatteki hiz

78. saatteki hiz

79. saatteki hiz

80. saatteki hiz

81. saatteki hiz

82. saatteki hiz

83. saatteki hiz

84. saatteki hiz

85. saatteki hiz

86. saatteki hiz

87. saatteki hiz

88. saatteki hiz

89. saatteki hiz

90. saatteki hiz

91. saatteki hiz

92. saatteki hiz

93. saatteki hiz

94. saatteki hiz

95. saatteki hiz

96. saatteki hiz

97. saatteki hiz

98. saatteki hiz

99. saatteki hiz

100. saatteki hiz

101. saatteki hiz

102. saatteki hiz

103. saatteki hiz

104. saatteki hiz

105. saatteki hiz

106. saatteki hiz

107. saatteki hiz

108. saatteki hiz

109. saatteki hiz

110. saatteki hiz

111. saatteki hiz

112. saatteki hiz

113. saatteki hiz

114. saatteki hiz

115. saatteki hiz

116. saatteki hiz

117. saatteki hiz

118. saatteki hiz

119. saatteki hiz

120. saatteki hiz

121. saatteki hiz

122. saatteki hiz

123. saatteki hiz

124. saatteki hiz

125. saatteki hiz

126. saatteki hiz

127. saatteki hiz

128. saatteki hiz

129. saatteki hiz

130. saatteki hiz

131. saatteki hiz

132. saatteki hiz

133. saatteki hiz

134. saatteki hiz

135. saatteki hiz

136. saatteki hiz

137. saatteki hiz

138. saatteki hiz

139. saatteki hiz

140. saatteki hiz

141. saatteki hiz

142. saatteki hiz

143. saatteki hiz

144. saatteki hiz

145. saatteki hiz

146. saatteki hiz

147. saatteki hiz

148. saatteki hiz

149. saatteki hiz

150. saatteki hiz

151. saatteki hiz

152. saatteki hiz

153. saatteki hiz

154. saatteki hiz

155. saatteki hiz

156. saatteki hiz

157. saatteki hiz

158. saatteki hiz

159. saatteki hiz

160. saatteki hiz

161. saatteki hiz

162. saatteki hiz

163. saatteki hiz

164. saatteki hiz

165. saatteki hiz

166. saatteki hiz

167. saatteki hiz

168. saatteki hiz

169. saatteki hiz

170. saatteki hiz

171. saatteki hiz

172. saatteki hiz

173. saatteki hiz

174. saatteki hiz

175. saatteki hiz

176. saatteki hiz

177. saatteki hiz

178. saatteki hiz

179. saatteki hiz

180. saatteki hiz

181. saatteki hiz

182. saatteki hiz

183. saatteki hiz

184. saatteki hiz

185. saatteki hiz

186. saatteki hiz

187. saatteki hiz

188. saatteki hiz

189. saatteki hiz

190. saatteki hiz

191. saatteki hiz

192. saatteki hiz

193. saatteki hiz

194. saatteki hiz

195. saatteki hiz

196. saatteki hiz

197. saatteki hiz

198. saatteki hiz

199. saatteki hiz

200. saatteki hiz

201. saatteki hiz

202. saatteki hiz

203. saatteki hiz

204. saatteki hiz

205. saatteki hiz

206. saatteki hiz

207. saatteki hiz

208. saatteki hiz

209. saatteki hiz

210. saatteki hiz

211. saatteki hiz

212. saatteki hiz

213. saatteki hiz

214. saatteki hiz

215. saatteki hiz

216. saatteki hiz

217. saatteki hiz

218. saatteki hiz

219. saatteki hiz

220. saatteki hiz

221. saatteki hiz

222. saatteki hiz

223. saatteki hiz

224. saatteki hiz

225. saatteki hiz

226. saatteki hiz

227. saatteki hiz

228. saatteki hiz

229. saatteki hiz

230. saatteki hiz

231. saatteki hiz

232. saatteki hiz

## Cöküş Problemine Çözüm Önerileri

### 1) Open Addressing

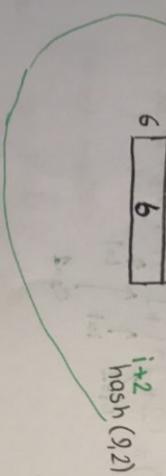
table size  $m \sim 2^N$  olduğunda rahat delete işlemi sıkıktır.  
ya yeniden düzenlenmeli.

calisyor.

#### 1.1 Linear Probing

$\text{hash}(\text{key}, i) = [\text{h}'(\text{key}) + i] \bmod m$   $i=0, \dots, m-1$

0	13
1	
2	2
3	3
4	9
5	
6	6



$$\text{hash}(9, 1) = (9+1) \bmod 7 = 3$$

$$\text{hash}(9, 2) = (9+2) \bmod 7 = 4$$

$$\begin{aligned} \text{key} &= 13 \\ \text{hash}(13, 0) &= 13 \bmod 7 = 6 \\ \text{hash}(13, 1) &= (13+1) \bmod 7 \\ &= 0 \end{aligned}$$

$i=0$   
 $h = \text{key} \bmod m$

$((i < m) \&\& (\text{hash}[h] == \text{key}))$   
 $\&\&$   
 $\text{hash}[h] != \text{NULL}$

$h = (h+1) \% m$

$\downarrow$

Linear Addressing

(23)



Scanned by Photo Scanner

(24)

## 1.2 Quadratc Probing

$$h(k, i) = (h'(k) + i^2) \bmod m$$

Linear Probing'de her yerlesecten elemen icin öncegin 1er pozisyon kayma durumu olabilin' Bunu önlemek icin arada bosluk bırakarak bir çözüm sunar.

0	
1	
2	
3	
4	
5	
6	9

$$\begin{aligned} h(9, 0) &= 9 \bmod 7 = 2 \\ h(9, 1) &= (2+1) \bmod 7 = 3 \\ h(9, 2) &= (2+2^2) \bmod 7 = 6 \\ h(k, i) &= (h'(k) + C_1 * i + C_2 * i^2) \\ C_1 &= 2 \quad C_2 = 1 \end{aligned}$$

$$\begin{aligned} h(9, 1) &= (2 + 2 * 1 + 1 * 1) \bmod 7 = 5 \\ C_1 &= 2 \quad C_2 = 1 \\ i &= 1 \quad i = 1 \\ C_2 &= 2 \end{aligned}$$

## 1.3 Double Hashing

$$h_1(\text{key}, i) = [h_2(\text{key}) + i * h_2(\text{key})] \bmod m$$

$h_1(\text{key}) = \text{key mod } m$

adim büyükligi

$$h_2(\text{key}) = 1 + (\text{key mod } k) \quad (k < m)$$

table size

genelde asal

0	1	2	3	4	5	6	7	8	9	10	11	12
+9			69	58		72						

$$h_1(\text{key}) = \text{key mod } 13$$

$$h_2(\text{key}) = 1 + (\text{key mod } 11)$$

$$i=0$$

$$\begin{aligned} \text{Ex: } h_1(14) &=? \longrightarrow h_1(14, 0) = h_1 \\ i &= 1 \\ k &= 11 \end{aligned}$$

$$h_1(14, 1) = 1 + [1 + 14 \bmod 11] * 1 = 1 + 4 = 5$$

$$i=2$$

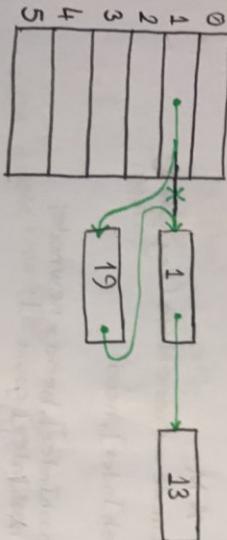
$$h_2(14, 2) = [1 + 4 * 2] \bmod 11 = 9$$

$$\begin{aligned} h_1(\text{key}) &\rightarrow \\ h_2(\text{key}) &\rightarrow \end{aligned}$$



Scanned by Photo Scanner

## 2 Separate Chaining



$M < N$   
Maximum  $\rightarrow M = N$

★  $m$  too small  $\rightarrow$  chains too long  
★ Statistical optimum value  $\rightarrow M \approx N/5$

key =  $13 \% 6 \rightarrow 1$   
key =  $1 \% 6 \rightarrow 1$   
key =  $19 \% 6 \rightarrow 1$

```

Struct node
{
    int key;
    char name[40];
    Struct node *next;
};

Struct hash
{
    struct node *head;
    int count;
};

Struct hash *hashTable = NULL;

int main()
{
    int key;
    char name[40];

    hashTable = (struct hash*) calloc(M, sizeof(struct hash));
    if(hashTable == NULL)
        return 0;

    insertInHash(key, name);
    searchInHash(key);
    deleteFromHash(key);

    return 0;
}
  
```

(26)

```
Void inserttoHash (int key, char name[])
{
    int hashIndex;
    struct node *newnode = createNode (key, name);
    if (!hashTable[hashIndex].head)
    {
        hashTable[hashIndex].head = newnode;
        hashTable[hashIndex].count = 1;
        return;
    }
    newnode->next = hashTable[hashIndex].head;
    hashTable[hashIndex].head = newnode;
    hashTable[hashIndex].count++;
    return;
}

struct node *createNode (int key, char *name)
{
    struct node *newnode;
    newnode = (struct node*) malloc (sizeof(struct node));
    newnode->key = key;
    strcpy (newnode->name, name);
    newnode->next = NULL;
    return newnode;
}

void searchInHash (int key)
{
    int hashIndex = key % M, flag = 0;
    struct node *myNode;
    myNode = hashTable[hashIndex].head;
    if (!myNode)
    {
        printf ("Search element unavailable in hash table\n");
        return;
    }
    while (myNode != NULL && flag == 0)
    {
        if (myNode->key == key)
        {
            printf ("\nVoter ID : %d\n", myNode->key);
            printf ("Name : %s\n", myNode->name);
            flag = 1;
        }
    }
}
```



Scanned by Photo Scanner

```

myNode = myNode->next;
}
if (!flog)
printf("yok!");
return;
}

void deleteFromHash (int key)
{
    int hashIndex = key % M;
    struct node *temp, *myNode;
    myNode = hashTable[hashIndex].head;
    if (myNode)
    {
        printf("Given data is not present in hash Table!\n");
        return;
    }
    temp = myNode;
    while (myNode != NULL && flog != 1)
    {
        if (myNode->key == key)
        {
            flog = 1;
            if (myNode == hashTable[hashIndex].head)
                hashTable[hashIndex].head = myNode->next;
            else
                temp->next = myNode->next;
            hashTable[hashIndex].count--;
            free(myNode);
        }
        temp = myNode;
        myNode = myNode->next;
    }
    if (flog)
        printf("Data deleted successfully from Hash Table!\n");
    else
        printf("Given data is not presented in hash Table\n");
}

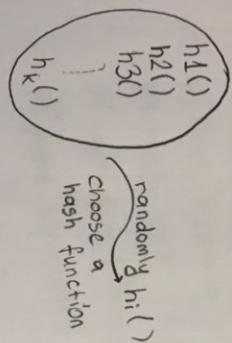
```



(28)

### [3] Universal Hashing

15, 22, 29 → hash → 1



- Kullanılan Hash Fonksiyonları -

$$\hookrightarrow h_{a,b}(\text{key}) = [(a * k + b) \bmod p] \bmod m$$

a, b, p → chosen randomly

$$p=17, m=6, a=3, b=4$$

Table size is not random

$$h(8) = ((3 * 8 + 4) \bmod 17) \bmod 6 = 5$$

open addressing : M > N  
separate chaining : M < N

$$\alpha = \frac{N}{M} : \text{load factor}$$

open addressing linear probe

$$\frac{\alpha}{M} \rightarrow \frac{\# \text{ of probe}}{10} \rightarrow \overset{N}{\overbrace{\dots}}$$

$$\left(\frac{1}{2}\right) \checkmark$$

0,1	→ 1,11
0,2	→ 1,28
0,3	→ 1,52
0,4	→ 1,89
0,5	→ 2,5
0,6	→ 3,62
0,8	→ 13,00
0,9	→ 50,50



### Unsuccessful Search

$P(\text{first location is occupied}) = \alpha$

$P(\text{empty cell}) = (1-\alpha)$

$P(\text{first two is occupied}) = \alpha * \alpha$

$P(\text{probe terminates 2 steps}) = \alpha * (1-\alpha)$

1<sup>st</sup> step      2<sup>nd</sup> step

$P(\text{probe terminates } k \text{ steps}) = \alpha^{k-1} * (1-\alpha)$

Average # of steps:

$$\sum_{k=1}^m k * \alpha^{k-1} * (1-\alpha) \Rightarrow \text{geometric series} = \frac{1}{1-\alpha}$$

Expected number of probes  
in unsuccessful search.

$$\text{insertion expected # of probes} \rightarrow \frac{1 + \frac{1}{(1-\alpha)^2}}{2}$$

Average # of probes  
successful search  
linear probe

quadratic  
double

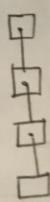


30

### Separate Chaining

#### ① Unsuccessful search

$$\alpha = \frac{N}{M}$$



Worst case: Bituin elemenlar oyn adreste.

Average case:  $\alpha = \frac{N}{M}$

Expected length of a probe  $\Rightarrow \alpha = \frac{N}{M}$

$$\Theta(1 + \alpha) \xrightarrow{\text{search hash function}} \Theta(1 + \alpha) = \Theta(1)$$

$$\alpha = \frac{N}{M} \Rightarrow \text{sabit}$$

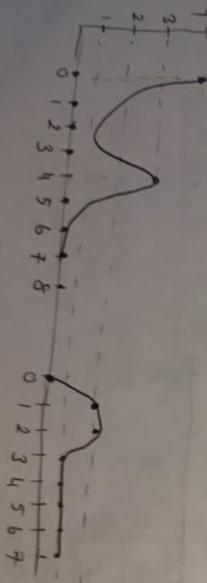
keys: 64, 100, 128, 200, 300, 400, 500

table size = 8  $\rightarrow \text{hash(key)} = x \bmod 8$

$$\begin{array}{ll} 64, 128, 200, 400 \rightarrow 0 & \text{because } \gcd(64, 100, 128, 200, 300, \\ 100, 300, 500) = 4 & 400, 500, 8) = 4 \end{array}$$

table size = 7  $\rightarrow \text{hash(key)} = x \bmod 7$

$$\begin{array}{ll} 64, 100 \rightarrow 1 & \text{because } \gcd(64, 100, 128, 200, 300, 400, 500, 7) = \frac{1}{7} \\ 100, 128 \rightarrow 2 & \\ 500 \rightarrow 3 & \\ 200 \rightarrow 4 & \\ 300 \rightarrow 5 & \end{array}$$



## Dynamic Programming

Planning Richard Bellman (1950's)

(31)

Example Fibonacci Numbers

0 1 1 2 3 5

int fibonacci(int n)

```

    {
        if (n==0)
            return 0;
        if (n==1)
            return 1;
        else
            return fibonacci(n-1)+fibonacci(n-2);
    }

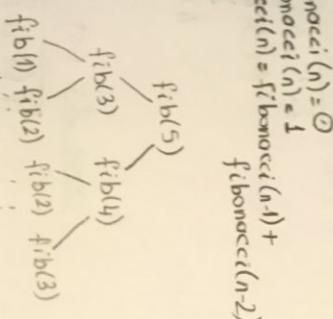
```

Recurrence Relation:

$$f_{\text{fibonacci}}(n) = f_{\text{fibonacci}}(n-1) + f_{\text{fibonacci}}(n-2) \quad (1, 6)^n$$

0	1	1	2	3	5		6	7	8
fibonacci									

Summation  
cok fazla teknik  
lenen hepsi  $\downarrow$



$\heartsuit$  Hesaplamaları tek tek yeniden değil, bu direkti gözde daha önce hesaplanmış değerleri kullanıyor.

abandon  
select

## Example 0-1 Knapsack Problem

$\setminus W$  → weight capacity of bag

Brute force:  $2^n$

Ex:

$$W = 5$$

weight

item 1 2 3 4 5

item 1 2 3 4 5

item	weight	value
1	2	12
2	1	10
3	3	20
4	2	15

$P(i,j)$  = maximum profit  
from item 1 to i  
from weight 1 to j

maximum kazanç  
subject to  $W$

		item	1	2	3	4	5
		item	1	2	3	4	5



Scanned by Photo Scanner

(32)

case 1: thief takes item  $i$

$$P(i, \omega) = P(i-1, \omega - w_i) + \sqrt{2}$$

$$i=3, \omega_3=2$$

$$P(3, 4) = P(2, 2) + \sqrt{3}$$

4 kilo gelindiğinde  
maximum kazanç

$$\begin{aligned} i &= 3 \\ P(3, 3) &= P(2, 1) + \sqrt{3} \\ &= 2 + \sqrt{3} \end{aligned}$$

esde  
3 kg'a kadar

case 2: not takes item  $i$

$$P(i, \omega) = P(i-1, \omega)$$

$$P[i, \omega] = \begin{cases} P[i-1, \omega] & \text{if } w_i > \omega \\ \max \left\{ \frac{w_i + P[i-1, \omega - w_i]}{P[i-1, \omega]} \right\} & \text{others} \end{cases}$$

initialization  $\rightarrow P[0, \omega] = 0$ ,  $P[i, 0] = 0$

$$w_1 = 2$$

$$P[1, 2] = \max \{P[0, 0], 0\} = 12$$

$$P[0, 2] + 12$$

$$P[1, 3] = \max \{P[0, 1] + 10, P[1, 2]\} = 12$$

$$P[1, 2] = \max \{P[1, 1] + 10, P[1, 2]\} = 12$$

$$P[2, 1] = \max \{P[1, 0] + 10, P[2, 1]\} = 12$$

$$P[2, 2] = \max \{P[1, 1] + 10, P[2, 2]\} = 22$$

$$P[2, 3] = \max \{P[1, 2] + 10, P[2, 3]\} = 22$$

$$P[2, 4] = \max \{P[1, 3] + 10, P[2, 4]\} = 22$$

$$w_4 = 2$$

$$P[4, 1] = P[3, 1] = 27$$

$$P[4, 2] = \max \{P[3, 2] + 15, P[4, 1]\} = 15$$

$$P[4, 3] = \max \{P[3, 3] + 15, P[4, 2]\} = 25$$

$$P[4, 4] = \max \{P[3, 4] + 15, P[4, 3]\} = 32$$

$$w_3 = 3$$

$$P[4, 1] = \max \{P[3, 2] + 15, P[4, 1]\} = 30$$

$$P[4, 2] = \max \{P[3, 3] + 15, P[4, 2]\} = 30$$

$$P[4, 3] = \max \{P[3, 4] + 15, P[4, 3]\} = 37$$

$$P[3, 5] = \max \{P[2, 2] + 20, P[3, 5]\} = 32$$



Scanned by Photo Scanner

	0	1	2	3	4	5
0	0	1	2	3	4	5
1	0	0	0	0	0	0
2	0	10	12	22	22	✓ $w_1=2$
3	0	10	12	22	30	32 $\times w_2=1$
4	0	10	15	25	30	37 $\checkmark w_3=3$

Reconstructing Optimal Solution  
 $p[i,j] = p[i-1,j]$   
 $p[i,j] \rightarrow p[i-1,j-w_i]$

$$p[i,j] = p[i-1,j] + w_i$$

$w_1=2$

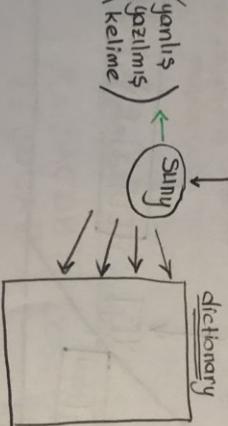
$w_2=1$

$w_3=3$

Hangi itemler alınmış?

### Edit Distance

Sunny



### The Levenshtein Algorithm (Edit Distance)

Sunny → sunny

Sunny → sun-y

Sunny → Sunnny

Tiplenecek olası hatalar

dist(MATHS, ARTS) → MATHS

ARTS

MATHS  
ARTS

(33)



Scanned by Photo Scanner

(34)

$X[1, \dots, m] \quad \forall e \quad Y[1, \dots, n]$

① copy

change

$$ED[i,j] = ED[i-1,j-1]$$

$\downarrow$

$Y[j]$

Ex: MATHS  
ARTS  
change  
insert

③ insert

$X[i]$

$Y[j]$

$\downarrow$

$$ED[i,j] = ED[i-1,j] + cost$$

MATHS  
ARTS

delete

$Y[j]$

$\downarrow$

$$ED[i,j] = ED[i-1,j-1] + cost$$

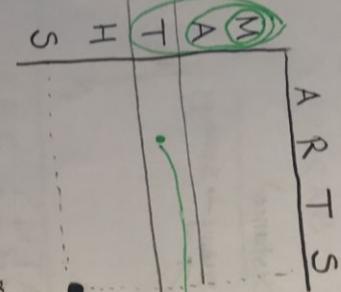
MATHS : Ex  
ARTS

insert  
change

$Y[j]$

$\downarrow$

$$ED[i,j] = ED[i-1,j-1] + cost$$



minimum  
distance

$ED[i,j]$ :  $x[i]$ ,  $y[j]$   
minimum mesafe

### Recurrence Relation

$$ED[i,j] = \begin{cases} ED[i-1,j-1] + 0 & : \text{copy} \\ ED[i-1,j-1] + cost & : \text{change} \\ \min \{ ED[i-1,j] + cost, \text{insert} \} & : \text{otherwise} \\ ED[i-1,j-1] + cost & : \text{delete} \end{cases}$$

$$ED[i,j] = \begin{cases} ED[i-1,j-1] + 0 & : \text{copy} \\ ED[i-1,j-1] + cost & : \text{change} \\ \min \{ ED[i-1,j] + cost, \text{insert} \} & : \text{otherwise} \\ ED[i-1,j-1] + cost & : \text{delete} \end{cases}$$

if ( $x[i] = y[i]$ )

otherwise



Scanned by Photo Scanner

Initialize:  $ED[i, 0] = i$ ,  $ED[0, j] = j$

$\begin{array}{c} A \\ R \\ T \\ S \end{array}$   $\rightarrow$  sonlu türün her<sup>1</sup>ki silinmiş gibi düşün

Soruşunun cevabı bulunulabilir

MATHS ne oldu da ARTS oldu

1. deneme: MATHS

→ ARTS

2. deneme: MATHS  
→ ARTS

Sonki tüm harfler  
ler eklenmiş gibi  
düşün

minimum  
distance

### Longest Common Subsequence

X: BACDB } LCS: BCB  
Y: BD CAB } BDB  
              BAB

$$LCS[i, j] = \begin{cases} LCS[i-1, j-1] + 1, & \text{if } X[i] = Y[j] \\ \max \left\{ \begin{array}{l} LCS[i-1, j], \\ LCS[i, j-1] \end{array} \right\}, & \text{otherwise} \end{cases}$$

?

8. Hafta

< A, C, G, T >

X: ATCTGAT } Longest Common Subsequence of X and Y  
Y: TGCATA }

$$\begin{aligned} LCS(X, Y) &= TCTA \\ LCS(X, Y) &= TGAT \end{aligned}$$

Subsequence  
KZALAK

KAL  
KOL  
KOLA  
KALK

(35)

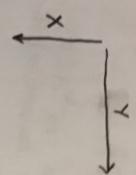


Scanned by Photo Scanner

(36)

$$\begin{aligned} X &= \langle x_1, x_2, \dots, x_m \rangle \\ Y &= \langle y_1, y_2, \dots, y_n \rangle \end{aligned} \quad \text{LCS}$$

$$\begin{aligned} S &= \langle s_1, s_2, \dots, s_k \rangle \\ S_{i_1}, S_{i_2}, \dots, S_{i_k} \\ i_1 < i_2 < \dots < i_k \end{aligned}$$



Önek:  $X: \langle BACDB \rangle$

$X_i \quad Y_j \rightarrow C[i,j]$  → 0 noktaya kadar  
ontok eklemeğin  
uçuunuğu

		B		C		D		A		B	
		B	C	D	A	C	D	A	B	C	D
X	Y	0	0	0	0	0	0	0	0	0	0
		1	1	1	1	1	1	1	1	1	1
X	Y	0	1	1	1	2	2	2	2	2	2
		1	2	2	2	3	3	3	3	3	3

Hangi harfleri alındığında dair  
[M,N] içinden ilerlemeye başladığında  
harf ortak olarak alındı m1 alınmadı m1  
belli olmuyor karıncası oluyor.

CÖZÜM

Yeni bir Matris

ADD: 0  
SKIPX: 1  
SKIPPY: 2

$x_i = y_j \rightarrow B[i,j] = \text{ADD}$   
 $x_i \neq y_j \rightarrow C[i-1,j] \succ C[i,j-1] \text{ then}$

$x[i] \text{ not in LCS}$   
 $B[i,j] = \text{SKIPX}$

$B[6,5]$

$B[6,5]$

else

$B[i,j] = \text{SKIPPY}$   
 $y[j] \text{ is not in LCS}$

BCB



Scanned by Photo Scanner

### Longest Common Subsequence

```
while ((i!=0) && (j!=0))  
{  
    switch (b[i][j])  
    {  
        case ADD:  
            add x[i] to front of LCS  
            i--;  
            j--;  
            break;  
        case SKIP:  
            i--;  
            break;  
        case SKIPY:  
            j--;  
            break;  
    }  
}
```

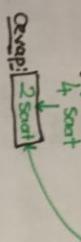
(37)



Scanned by Photo Scanner

(38)

- 4. Vize Cevapları -

5/① Çalışma zamanı :  $\mathcal{O}(N^2) + 13N^{4/3} + 12N + 3$ 
 $N \rightarrow 1$  saat  
 $2N \rightarrow ?$  (Bellek ve çalışma zamanının hızı  $\rightarrow \times 2$ )


5/②

 $3n^3 + 20n^2 + 5 \rightarrow \mathcal{O}(n^3)$  olduğunu gösteriniz.

 $3n^3 + 20n^2 + 5 \rightarrow \mathcal{O}(n^3)$  → BÖYLE SAĞMALANMIŞ

$f(n) \leq c g(n)$   
 $3n^3 + 20n^2 + 5 \leq c n^3$

$n=1$   
 $c=28$

$3+20+5 \leq 28$   
 $28 \leq 28$

10/③ İki algoritmanın performans karşılaştırması kılavuz.

Time complexity, Space complexity

- ↳ Best Case
- ↳ Average Case
- ↳ Worst-Case

- ↳ Theoretical Analysis
- ↳ Empirical Analysis (Girdiği artırıp denemeler yapmak)

15/④

void bubbleSort(int N, int \*dizi) {

```
int i=0, j=0, swap, tmp;
swap=1;
while ((i < N-2) && (swap==1)) {
    swap=0;
    while (j < N-2-i) {
        if (dizi[j] > dizi[j+1]) {
            swap=1;
            tmp=dizi[j+1];
            dizi[j+1]=dizi[j];
            dizi[j]=tmp;
            j++;
        }
    }
}
```



6/⑥

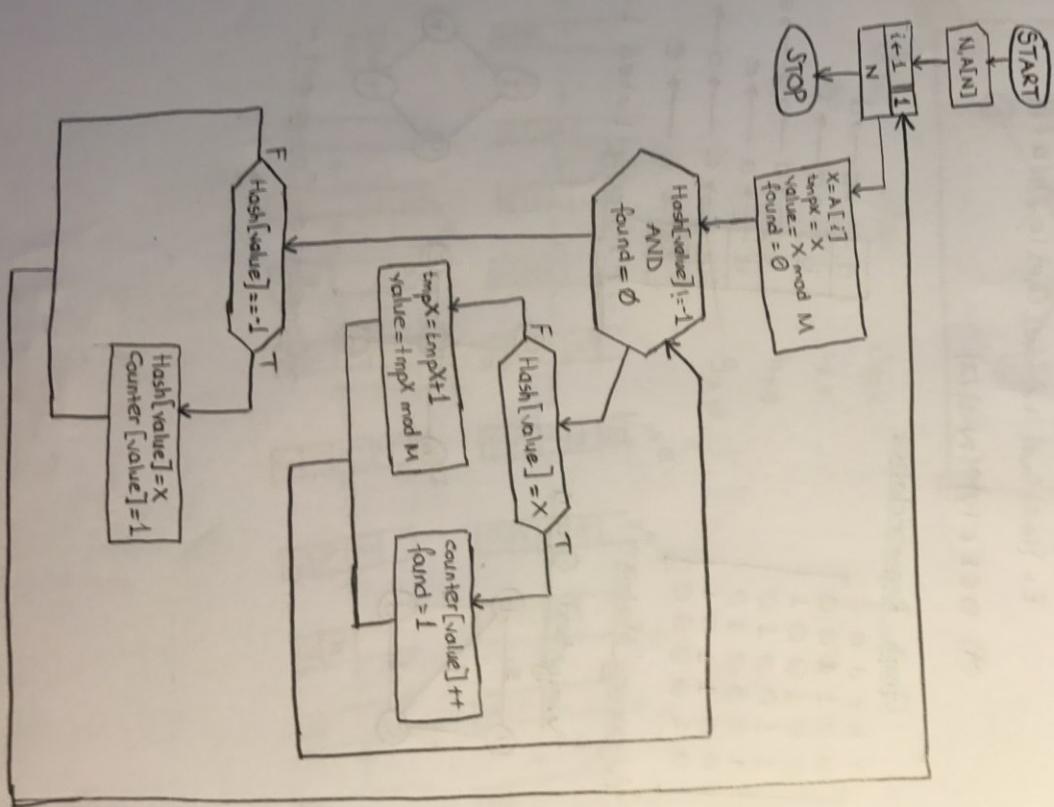
(A: ifode 2.ye göre)

$$\begin{aligned}
 & n(n+5) \text{ ve } 5000n^2 \xrightarrow{\dots} E \\
 & 2^{n+1} \xrightarrow{\dots} E \\
 & \log(n) \text{ ve } \ln(n) \xrightarrow{\dots} E \\
 & 1000n^2 \text{ ve } 1000n^3 \xrightarrow{\dots} K \\
 & (n-5)! \text{ ve } 2^n \xrightarrow{\dots} B \\
 & (10n+5)\log n \text{ ve } 100n + (nn)\log n \xrightarrow{\dots} E
 \end{aligned}$$

(39)

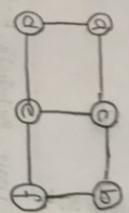
25/⑦

(E: exit, B: birgök, K: karek)



(40)

Graph  $\rightarrow G = \langle V, E \rangle$

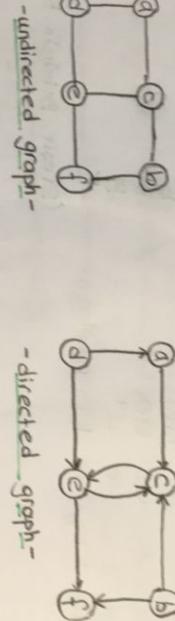


④  
Can be graph

$V = \{a, b, c, d, e, f\}$

$E = \{(a,c), (a,d), (b,c), (d,e), (c,e), (e,f), (b,f)\}$

\*  $0 \leq E \leq |V| * (|V|-1)/2$



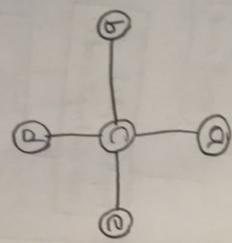
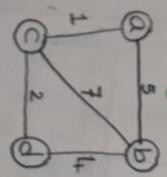
-directed graph-

Graph Representation

a	b	c	d	e	f
0	0	1	1	0	0
0	0	1	0	0	1
1	1	0	0	1	0
1	0	0	1	0	0
0	0	1	1	0	1
0	1	0	0	0	0

~Adjacency Matrix~

Weighted Graph

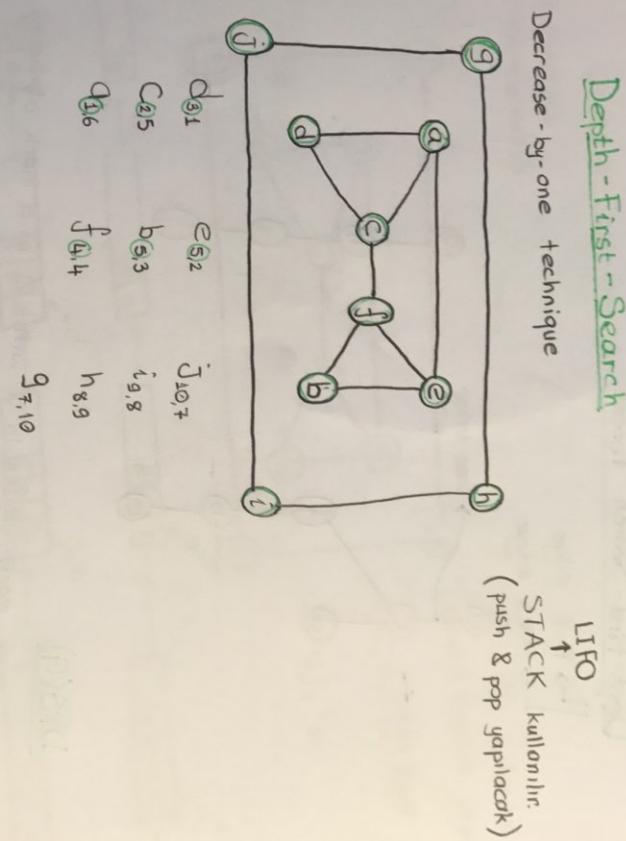
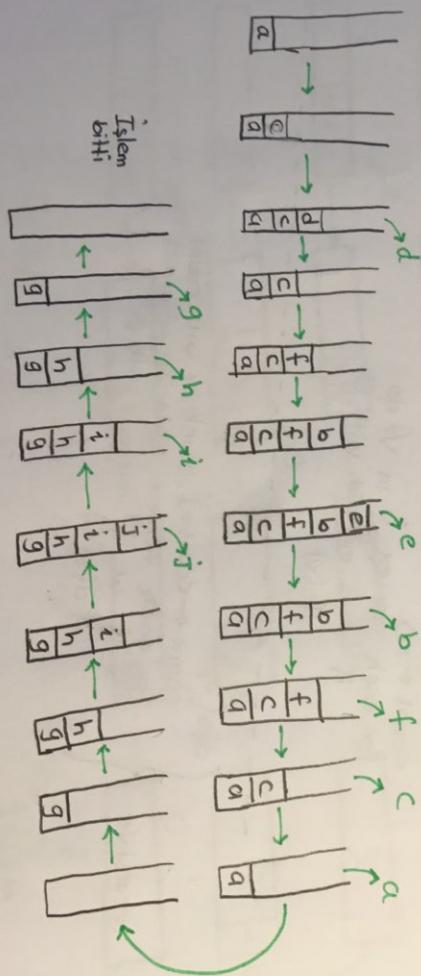


~Adjacency Linked List~

~Connected Component~



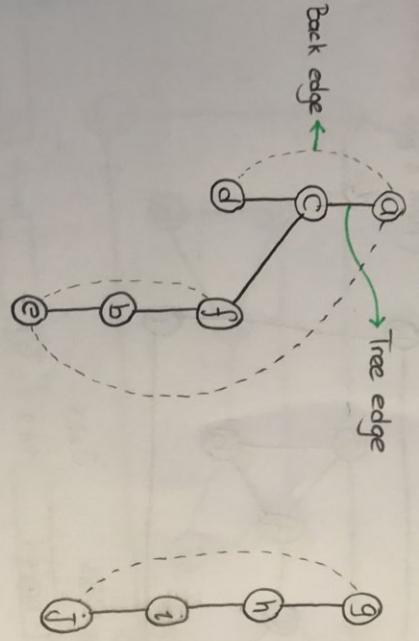
Scanned by Photo Scanner



(12)

### Dept-First-Search Forest

Tree edge  
Back edge



### DFS( $G$ )

mark each vertex in  $V$  with  $\emptyset$  as a mark of being unvisited

count  $\leftarrow 0$

for each vertex  $v$  in  $V$  do

if  $v$  is marked with  $\emptyset$

dfs( $v$ )

recursivve

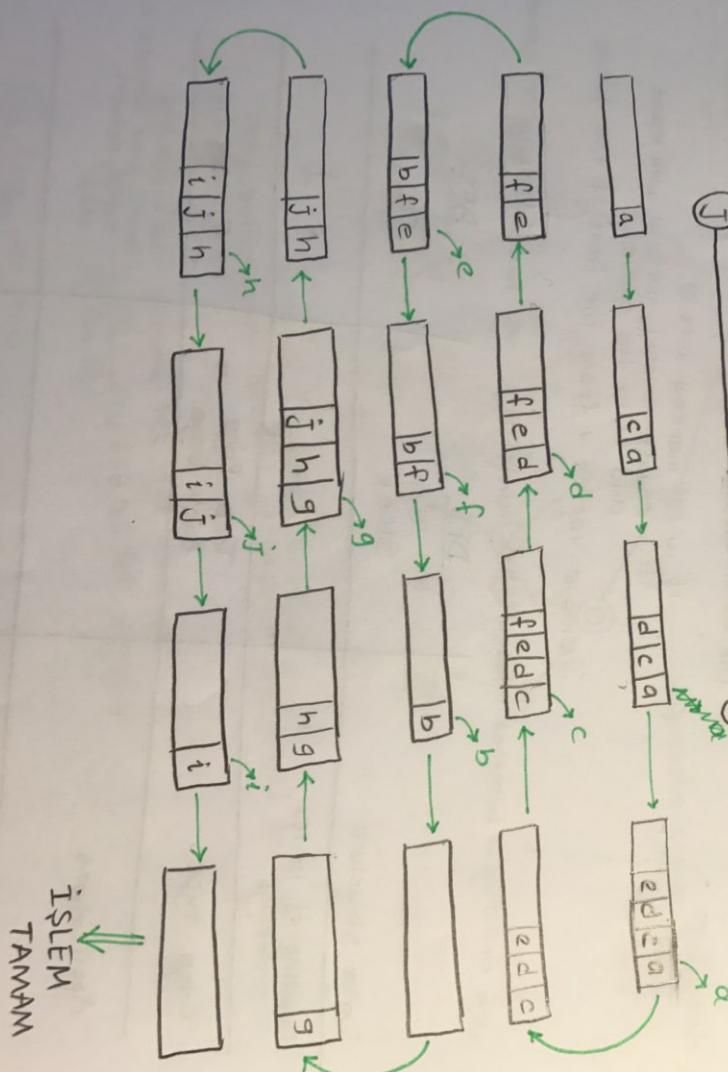
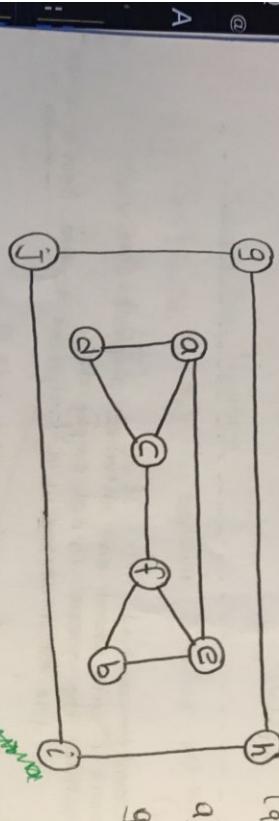
```
{ dfs( $v$ )
    count  $\leftarrow$  count + 1, mark  $v$  with count
    for each vertex  $w$  in  $V$  adjacent to  $v$ 
        if  $w$  is marked with  $\emptyset$ 
            dfs( $w$ )}
```

(43)

### Breadth-First-Search

cesur / brave → depth  
tedbirli / cautious → breadth

FIFO  
QUEUE (queue & enqueue yapılımları)  
a, c, d, e, f, g, b, h, i, j



(44)

BFS(G)

mark each vertex in  $V$  with  $\emptyset$  as a mark of being unvisited  
 $count \leftarrow 0$   
 for each vertex  $v$  in  $V$  do  
 if  $v$  is marked with  $\emptyset$   
 $bfs(v)$

bfs( $v$ )  
 $count \leftarrow count + 1$   
 mark  $v$  with  $count$  and initialize a queue with  $v$   
 while the queue is not empty do  
 for each vertex  $w$  in  $V$  adjacent to the front's vertex  
 if  $w$  is marked with  $\emptyset$   
 $count \leftarrow count + 1$ , mark  $w$  with  $count$   
 add  $w$  to the queue

remove vertex  $v$  from the front of the queue

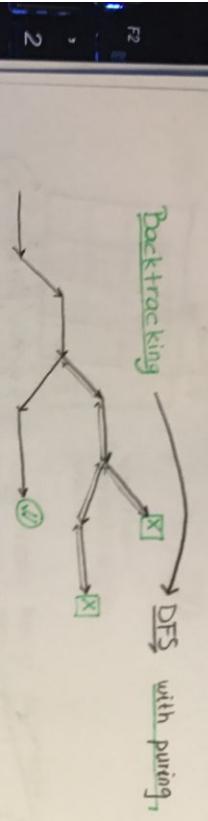
web crawling  $\rightarrow$  internet sitesinde link içinde link ve buradaki bilgileri okume

DFS      BFS

Data structure	Stack	Queue
Number of vertex orderings	2	1
Edge types	Tree Edge Back Edge	Tree Edge Cross Edge
Applications	(Web crawling Sosyal Ağlar Map)	(Belirli sınırlar içine) Social network

Efficiency for adjacent matrix	$\mathcal{O}( V ^2)$	$\mathcal{O}( V ^2)$
Efficiency for adjacent linked-list	$\mathcal{O}( V  +  E )$	$\mathcal{O}( V  +  E )$



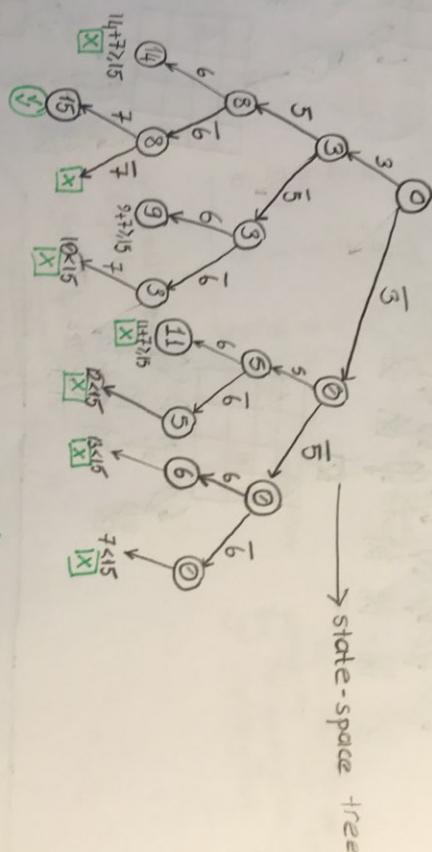


### Subset Sum Problem

$S = \{S_1, S_2, \dots, S_n\}$  toplamı d olan alt kümeler? ( $S_1 < S_2 < S_3 < \dots < S_n$ )

$$\underline{\text{Ex}} \quad S = \{3, 5, 6, 7\}, \quad d = 15$$

$$\text{Ex} \quad S = \{3, 5, 6, 7\} \quad d = 15$$



8-vezir problemi (n-queen problem) Saçınç tahtasına birbirini görmeyecek (yemeyecek) şekilde 8 vezirin yerlesimine.

1

**(1)** Her bir durumu tek tek denemek  
 $\binom{64}{4} = \frac{64!}{4!(64-4)!} = 1,426,165,368$  deneme

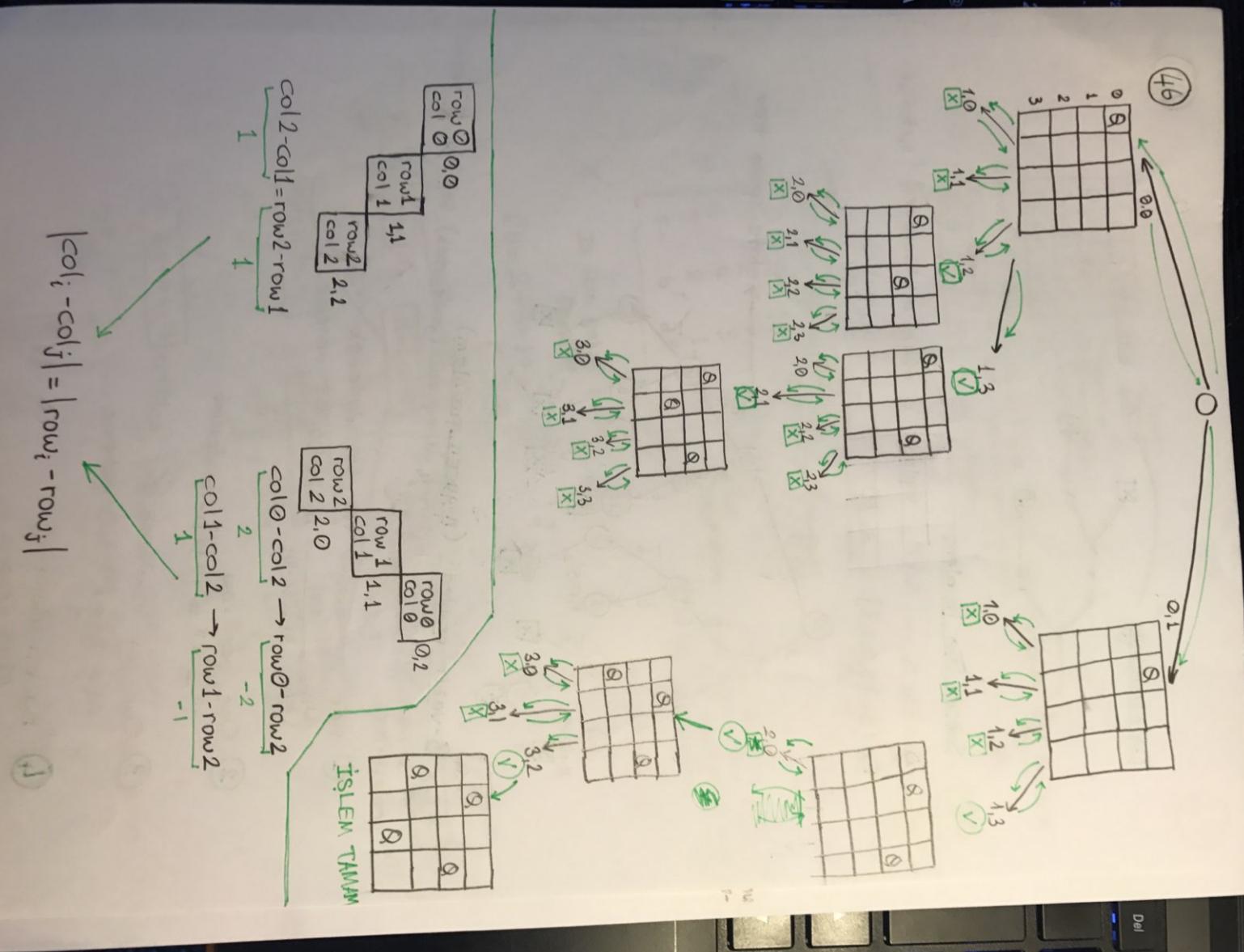
$$\binom{64}{8} = \frac{64!}{8!(64-8)!} = 4.426.165.368 \text{ deneme}$$

(2) One per row  
 $n = 88 = 16777.216$  deneme

③ One per row and per column  
 $n! = 8! = 40,320$  deneme

## ④ Backtracking

45



1	0	0	0
0	0	0	0
0	0	0	0
0	0	0	0

→ Vezirleri  
yerlestirdigim  
matris

\* Ekstra bir dizisi hangi vezir hangi satır lütfen onu sakarır.  
Hangi vezir (o satır veziri)  
Hangi sütundan

2	4	1	3
---	---	---	---

### Branch and Bound

BFS

$$C = \begin{bmatrix} 1 & 0 & 0 & 0 \\ 0 & 1 & 2 & 3 \\ 0 & 0 & 0 & 0 \\ 2 & 4 & 1 & 3 \end{bmatrix}$$

Eliminde 02 paro size  
yapılacakları  
yapılmış  
en çok 4'le yapmış  
ya çalışıyoruz.

İş için teklif edilen  
fiyatlar

$$lb = 2 + 3 + 1 + 4 = 10$$

Start

a=J1

b=J2

c=J3

d=J4

lb= 9+3+1+4=17

a=J1

b=J2

c=J3

d=J4

lb= 2+8=10

a=J1

b=J2

c=J3

d=J4

lb= 2+6+5=13

a=J1

b=J2

c=J3

d=J4

lb= 2+6+1+4=13

a=J1

b=J2

c=J3

d=J4

lb= 2+6+1+4=13

a=J1

b=J2

c=J3

d=J4

"Üst seviyelerde daha uygun  
fiyat bulma ihtiyaci olmadığından  
buunu sonuc alırız.

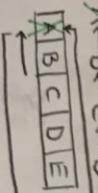


(48)

### Priority Queue

First-in-first-out

A  $\leftarrow$  B  $\leftarrow$  C  $\leftarrow$  D



-array

-linked list

- ① - unsorted array -

[A B C D E]

-insert  
-remove

$O(1)$

- ② - sorted array -

[2 4 5 7 9]

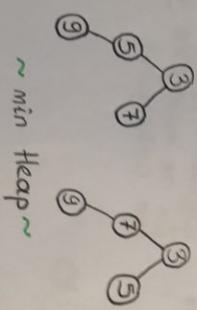
-insert  $O(n)$

[2 4 5 6 7 9]

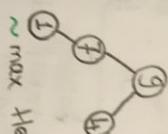
-remove  $O(n)$

$O(1), O(n)$

linked circular  
array



~ min heap ~



~ max heap ~

### Heap Tree

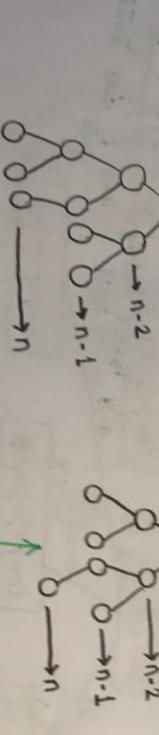
◊ Complete Binary Tree  
◊ Balanced

→ depth 0

→ n-2

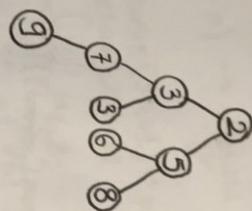
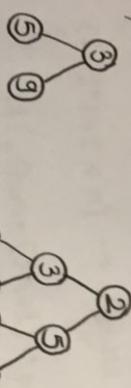
→ n-1

→ n

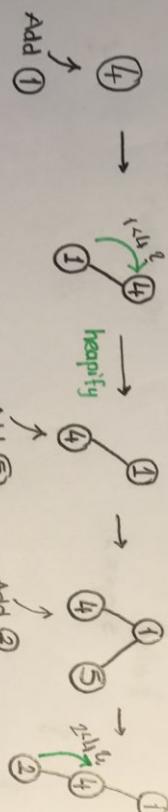


② a parent's value  $\leq$  its children's values : min Heap

(49)



Heapify



↓  
random val

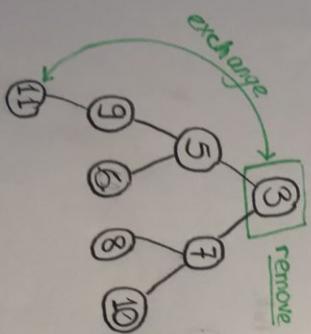
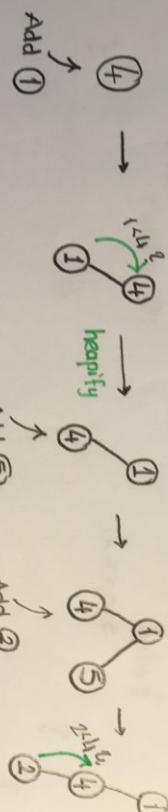
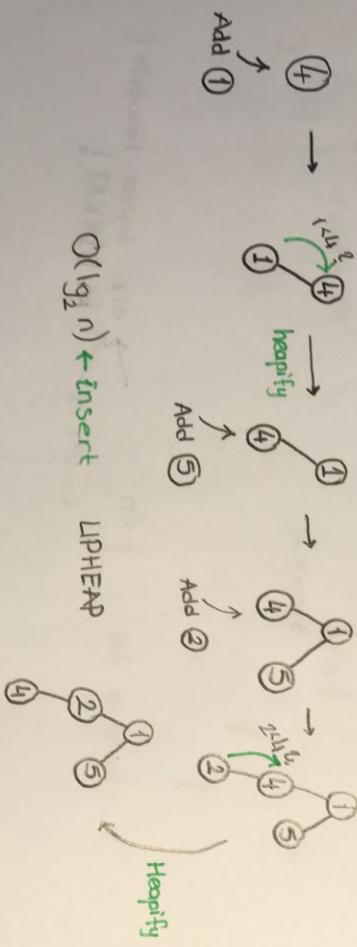
↓ MA O( $\lg_2 n$ )  $\leftarrow$  insert

UPHEAP

Add 5

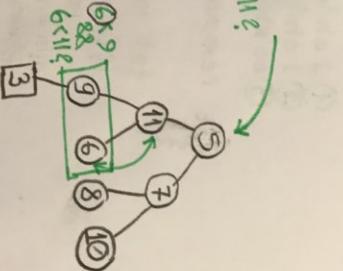
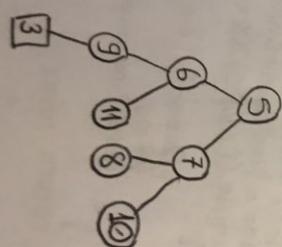
Add 2

Heapify



DOWNHEAP

O( $\lg_2 n$ )  $\leftarrow$  remove



↓

↓  
DOWNHEAP



Scanned by Photo Scanner

(50)

```

void insert(int newItem, int n, int pQueue[])
{
    int i, stop = 0, parent;
    pQueue[n] = newItem;
    i = n;
    n++;
    while ((i > 0) && (!stop))
    {
        parent = (i - 1) / 2;
        if (pQueue[i] < pQueue[parent])
        {
            pQueue[i] ↔ pQueue[parent];
            i = parent;
        }
        else
            stop = 1;
    }
}

int remove(int n, int pQueue[])
{
    int min, i, adr;
    if (n == 0)
        return -1;
    min = pQueue[0];
    pQueue[0] ↔ pQueue[n - 1];
    pQueue[0] ↔ pQueue[n - 1];
    n--;
    i = 0;
    adr = findSmallChild(i, pQueue[], n);
    while ((adr > 0) && (pQueue[adr] < pQueue[i]))
    {
        pQueue[i] ↔ pQueue[adr];
        i = adr;
        adr = findSmallChild(i, pQueue[], n);
    }
    return min;
}

```

(51)

```
int findSmallChild(int i, int pQueue[], int n)
{
    if (2*i+2 < n) → 2 child
    {
        if (pQueue[2*i+1] < pQueue[2*i+2])
            return 2*i+1;
        else
            return 2*i+2;
    } else if (2*i+1 < n) → 1 child
        return 2*i+1;
    else
        return 0;
}
```



Scanned by Photo Scanner