

PAL

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- STANDARDNÍ GRAFOVÉ ÚLOHY S POLYNOMIÁLNÍ SLOŽITOSTÍ ŘEŠENÍ
- KOMBINATORICKÉ A ČÍSELNÉ TEORETICKÉ ALGORITMY
- IZOMORFIZMUS
- PRVOČÍSELNOST
- VYHLEDÁVACÍ STROMY A JEJICH VYUŽITÍ
- VYHLEDÁVÁNÍ V TEXTU ZALOŽENÉ NA KONEČNÝCH AUTOMATECH
- ASYMPTOTICKÝ RŮST FUNKCÍ

-  $f(n) \in O(g(n))$

$$\exists c > 0 \exists n_0 \forall n > n_0: |f(n)| \leq |c \cdot g(n)|$$

-  $f(n) \in \Omega(g(n))$

$$\exists c > 0 \exists n_0 \forall n > n_0: |f(n)| \geq |c \cdot g(n)|$$

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

$$\exists c_1 > 0 \exists c_2 > 0 \exists n_0 \forall n > n_0: |c_1 \cdot g(n)| \leq |f(n)| \leq |c_2 \cdot g(n)|$$

- GRAPH

-  $G = (V, E)$

-  $V$  = VERTICES

-  $E$  = EDGES

- DIRECTED, UNIDIRECTED

- WEIGHTED  $W: E \rightarrow \mathbb{R}$

- NODE DEGREE

- NODES  $x$  AND  $y$  LINKED BY EDGE  $e$

- NODES  $x$  AND  $y$  ARE INCIDENT TO  $e$

- FUNCTION RETURNING NUMBER OF EDGES INCIDENT TO GIVEN NODE

- FOR DIRECTED GRAPH THERE IS IN AND OUT DEGREE

- HANDSHAKING LEMMA

$$\sum_{n \in V} \text{DEG}(n) = 2|E|$$

- SUM OF DEGREES OF NODES IS EQUAL TO TWO TIMES THE NUMBER OF EDGES

- EACH EDGE IS CONNECTED TO TWO VERTICES

- COMPLETE GRAPH

$$E = \binom{V}{2}$$

$$- (V_n \in V): \text{DEG}(n) = |V| - 1$$

- PATH

- SEQUENCE OF VERTICES AND EDGES

- EACH VERTICES HAVE TO DIFFER FROM EACH OTHER

- CIRCUIT

- ORIENTED

- CLOSED PATH

- CYCLE

- NON-ORIENTED CIRCUIT

- CONNECTED GRAPH

- FOR EACH VERTICES  $x$  AND  $y$  IN  $G$

- THERE IS PATH FROM  $x$  AND  $y$

## - TREE

- CONNECTED GRAPH WITHOUT CYCLES
- IF ARBITRARY NEW EDGE IS ADDED, THEN CYCLE OCCURS
- IF WE REMOVE EDGE, IT BECOMES DISCONNECTED
- THERE ARE  $|V| - 1$  EDGES
- EVERY TWO VERTICES ARE CONNECTED BY SINGLE PATH ONLY
- LEAF
  - DEGREE 1
- ROOT
  - NO INCOMING EDGES

## - ADJACENCY MATRIX

## - LAPLACIAN MATRIX

- ADD VERTEX DEGREE ON DIAGONAL

## - DISTANCE MATRIX

- ADD DISTANCES (WEIGHTS)

## - INCIDENCE MATRIX

$$M \begin{array}{|c|} \hline |E| \\ \hline \begin{array}{cc} 1 & -1 \\ \hline & 1 & -1 \\ \hline -1 & 1 \end{array} \\ \hline \end{array}$$

## - ADJACENCY LIST

## - DAG

- DIRECTED ACYCLIC GRAPH
- NO CYCLES

## - MULTIGRAPH

- MULTIPLE EDGES BETWEEN TWO VERTICES
- EDGE FROM NODE TO ITSELF

- DFS

- STACK

- BFS

- QUEUE

- PRIORITY QUEUE

- INSERT WITH PRIORITY

- SUBGRAPH

- TWO INCLUSIONS MUST BE SATISFIED

$$V(H) \subseteq V(G)$$
$$E(H) \subseteq E(G) \cap \binom{V(H)}{2}$$

- CREATED BY

- REMOVE SOME VERTICES

- REMOVE EDGES ADJACENT WITH REMOVED VERTICES

- TOPOLOGICAL ORDERING

- DAG

- WE ASSIGN NUMBER TO VERTICES

- FOR EACH PAIR OF VERTICES HOLDS

- IF THERE IS ~~ANY~~ DIRECTED PATH FROM X TO Y

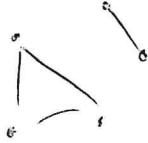
THEN NUMBER  $X \leq Y$

- CAN BE ASSIGNED BY DFS

## - CONNECTED COMPONENT

- SET OF VERTICES

$$C(v) = \{u \in V \mid \text{THERE EXISTS PATH IN } G \text{ FROM } u \text{ TO } v\}$$



## - SPANNING TREE

- SUBGRAPH  $H$  OF GRAPH  $G$

$$V(G) = V(H)$$

- THERE ARE ALL VERTICES OF  $G$

- AND  $H$  IS TREE

- MINIMUM SPANNING TREE

- SUM OF ITS WEIGHTS OF EDGES IS MINIMAL

- CUT OF GRAPH

- SUBSET OF EDGES WHICH DIVIDES GRAPH INTO TWO CONNECTED COMPONENTS

- EVERY MINIMUM SPANNING TREE CONTAINS EDGE OF CUT WITH THE SMALLEST WEIGHT

## - JARMIK - PRIMS ALGORITHM

- 1. SELECT ARBITRARY VERTEX AND ADD IT TO  $S$

- 2. SELECT EDGE ADJACENT WITH ANY VERTEX IN  $S$  WITH SMALLEST WEIGHT AND ADJACENT WITH  $V'_i, V'_i \notin S$

- 3. ADD  $V'_i$  TO  $S$

- REPEAT FROM 2. UNTILL ALL VERTICES ADDED TO  $S$

- IT TAKES  $|V(G)|$  STEPS
- VERTICES IN  $S$  AND THE REST CREATES CUT
  - WE SELECT EDGE OF THIS CUT TO SPANNING TREE WITH SMALLEST WEIGHT
  - SUCH EDGE MUST BE IN MINIMAL SPANNING TREE
- IMPLEMENTATION
  - STRAIGHTFORWARD
    - PARTITION WHICH VERTICES ARE IN M.S.T. AND WHICH NOT
    - TIME COMPLEXITY  $O(|V(G)| \cdot |E(G)|)$
  - IMPROVED
    - STORE ONLY EDGES OF ACTUAL CUT WITH LOWEST WEIGHT FOR EACH FOR ACTUAL SPANNING TREE  $O(m^2)$
    - USE HEAP  $O(\log(m) \cdot m)$

## - BORŪVKA'S ALGORITHM

- WHILE GRAPH HAS TWO OR MORE CONNECTED COMPONENTS
- SELECT THE EDGE WITH LIGHTEST WEIGHT CONNECTING TWO CONNECTED COMPONENTS
- STOPS AFTER  $\max \lceil \log_2 |V(G)| \rceil$  STEPS
- IMPLEMENTATION
  - WE DECOMPOSE FOREST TO CONNECTED COMPONENTS BY DFS
    - EACH VERTEX IS ASSIGNED TO NUMBER OF ITS COMPONENT
  - FOR EACH EDGE WE FIND OUT TO WHICH COMPONENT IT BELONGS TO AND WE STORE THE LIGHTEST EDGE ONLY
  - EACH ITERATION TAKES  $O(|E(G)|)$
  - ENTIRE ALGORITHM RUNS IN  $O(|E(G)| \cdot \log |V(G)|)$

## - KRUSKAL'S GREEDY ALGORITHM

- SORT EDGES BY WEIGHT

- ADD LIGHTEST EDGE TO MINIMAL SPANNING TREE IF IT IS STILL ACYCLIC

- IT STOPS AFTER  $|E(G)|$  ITERATIONS

## - IMPLEMENTATION

- SORTING TIME  $O(|E(G)| \cdot \log |E(G)|) = O(|E(G)| \cdot \log |V(G)|)$

- WE CAN STOP LOOP AFTER WE ADDED  $|V(G)| - 1$  EDGES

- WE HAVE TO MAINTAIN CONNECTED COMPONENTS

## - UNION - FIND

- FOR EACH ~~DISJOINT~~ CONNECTED COMPONENT ONE REPRESENTATIVE IS SELECTED

- REPRESENTATIVE OF COMPONENT  $C(v)$  IS LABELED AS  $r(v)$

- IF  $u$  AND  $v$  ARE IN THE SAME COMPONENT, THEN  $r(u) = r(v)$

## - FIND

- RETURNS REPRESENTATIVE  $r(u)$  OF CONNECTED COMPONENT  $C(u)$

~~WORKS~~

## - UNION

- MERGES TWO CONNECTED COMPONENTS  $C(u)$  AND  $C(v)$

## - SIMPLE SOLUTION

### - FIND

- JUST RETURN VALUE  $r(u)$  OF NODE

-  $O(1)$

### - UNION

-  $r(u) = \text{FIND}(u)$ ,  $r(v) = \text{FIND}(v)$

- IF  $r(u) \neq r(v)$

FOR THROUGH  $v$  AND REWRITE  $r(u)$  INTO  $r(v)$  OR

## - IMPROVED SOLUTION

- EACH COMPONENT STORED AS TREE

- ROOT ACTS AS REPRESENTATIVE

- FIND (w)

- CLIMBS THE TREE

- UNION

-  $r(w) = \text{FIND}(w)$ ,  $r(x) = \text{FIND}(x)$

- IF  $r(w) \neq r(x)$

- ROOT OF SMALLER COMPONENT IS MERGED INTO  
ROOT OF BIGGER COMPONENT

- TIME COMPLEXITY OF BOTH UNION AND FIND IS

$$O(\log |V|)$$

- COMPLEXITY OF KRUSKAL'S ALGORITHM WITH UNION FIND

- ~~sort~~  $O(|E(G)| \cdot \log |V(G)|)$

## - STRONGLY CONNECTED COMPONENT

- IN DIRECTED GRAPH

- MAXIMAL SET OF STRONGLY CONNECTED VERTICES

- THERE EXIST ~~any~~ ORIENTED PATH BETWEEN EVERY COUPLE OF  
VERTICES



## - KOSARAJU - SHARIR ALGORITHM

- STACK
- DFS OF GRAPH  $G$ .
- IF WE CLOSE VERTEX  $v$ , ADD  $v$  TO STACK
- REVERSE THE EDGES
- WHILE SOMETHING ON STACK
  - POP STACK
  - DFS FROM POPEP VERTEX (IF NOT CLOSED ALREADY)
  - ALL VERTICES VISITED BY DFS, ADD TO STRONGLY CONNECTED COMPONENT AND CLOSE THEM
- PERFORMS TWO TRAVERSALS OF GRAPH
- IF GRAPH REPRESENTED AS ADJACENCY LIST, THEN ALGORITHM RUNS IN  $\Theta(|V|+|E|)$
- IF ADJACENCY MATRIX, THEN  $\Theta(|V|^2)$

## - TARJAN ALGORITHM

- DFS
- EACH NODE HAS TWO NUMBER
  - ~~BACK~~ ITS NUMBER
  - NUMBER OF LOWEST EDGE INTO WHICH WE CAN GET
- IF WE BACKTRACK TO ~~VERB~~ NODE  $n$  WE CLOSE ALL NODES REFERENCING TO  $n$  AND ADD IT TO ITS STRONGLY CONNECTED COMPONENT
- COMPLEXITY
  - ADJACENCY LIST  $\Theta(|V|+|E|)$
  - ADJACENCY MATRIX  $\Theta(|V|^2)$
  - IT RUNS FASTER THAN KOSARAJU - SHARIR ALGORITHM

## - EULER TRAIL PROBLEM

- DOES GRAPH  $G$  CONTAINS TRAIL THAT CONNECTS EVERY EDGE EXACTLY ONCE

- "DRAW IN SINGLE LINE"

- CONTAINS IF

- IT IS CONNECTED

- AND HAS 0 OR 2 VERTICES OF ODD DEGREE

- ALGORITHM

- DFS

- ADD EDGE TO TRAIL IF BACKTRACK

- ONE COMPLETE TRAVERSAL OF GRAPH

- ADJACENCY LIST  $\Theta(|V| + |E|)$

- ADJACENCY MATRIX  $\Theta(|V|^2)$

## - HAMILTON PATH

- DOES GRAPH CONTAINS PATH THAT VISITS EVERY NODE EXACTLY ONCE

- NPC HARD

## - HEAPS

- TREE BASED DATA STRUCTURE

- SATISFIES HEAP PROPERTY

- IF B IS A CHILD NODE OF A, THEN

$$\text{KEY}(B) \geq \text{KEY}(A)$$

- ONE OF THE MOST EFFICIENT IMPLEMENTATION OF PRIORITY QUEUE

- OPERATIONS

- INSERT (x)

- ACCESS - MIN

- DELETE - MIN

- DECREASE\_KEY (x, d)

- MERGE ( $H_1, H_2$ )

- DELETE (x)

- BINARY HEAP

- BINARY TREE WITH TWO ADDITIONAL CONSTRAINTS

- COMPLETE BINARY TREE, EXCEPT THE LAST LEVEL

~~EXPT~~ - IF LAST LEVEL IS NOT FILLED, THE NODES ARE FILLED FROM LEFT TO RIGHT

- EACH NODE IS LESS THAN OR EQUAL TO TO EACH OF ITS CHILDREN

- INSERT (x)

- ADD NODE TO THE END OF HEAP

- PROPAGATE NODE UP IF IT IS SMALLER THAN PARENT

- SWAP PLACES OF NODE AND PARENT

- ACCESS MIN

- GET VALUE FROM POINTER TO ROOT

- DELETE MIN

- SWITCH POSITION OF ROOT AND LAST NODE OF HEAP

- REMOVE THE LAST ELEMENT

- WHILE ~~ROOT~~ ROOT IS LARGER THAN ITS CHILDREN, SWITCH ROOT AND SMALLER CHILDREN

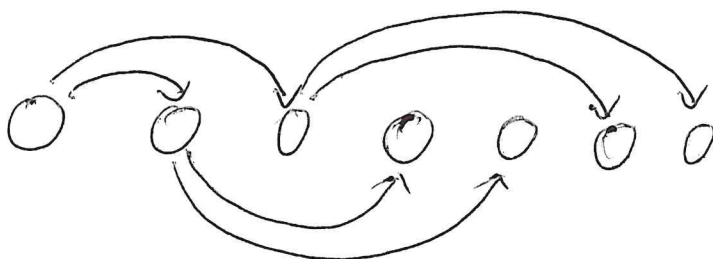
- DELETE

- SAME AS DELETE MIN

- BUT WE SWAP DELETED NODE (INSTEAD OF ROOT) AND LAST VALUE

- DATA REPRESENTATION

- ARRAY



## - TIME COMPLEXITIES

- INSERT  $O(\log(n))$
- DELETE  $O(\log(n))$
- ACCESS\_MIN  $O(1)$
- DELETE\_MIN  $O(\log(n))$
- DECREASE\_KEY  $O(\log(n))$
- BUILD\_HEAP  $O(n)$
- MERGE  $O(n)$

## - D-ARY HEAP

- DIFFERENT NUMBER OF CHILDREN
- OPERATIONS ARE ANALOGICAL
- TIME COMPLEXITY HAS DIFFERENT BASE OF LOGARITHM
- THEY ARE FASTER THAN BINARY HEAP FOR HEAP SIZE EXCEEDING THE SIZE OF CACHE

## - BINOMIAL HEAP

- COLLECTION OF BINOMIAL TREES
  - OF DEGREES  $i = 0, \dots, \lfloor \log(n) \rfloor$
  - THERE CAN BE EITHER ONE OR ZERO BINOMIAL TREES FOR EACH DEGREE
  - EACH TREE OBEYS HEAP PROPERTIES
    - KEY FOR CHILD IS LOWER THAN FOR PARENT
  - IT IS DEFINED RECURSIVELY
    - ORDER 0
      - SINGLE NODE
    - DEGREE  $n$  HAS A ROOT NODE WHOSE CHILDREN ARE ROOTS OF BINOMIAL TREES OF DEGREES  $n-1, n-2, \dots, 2, 1, 0$

- FOR BINOMIAL TREE OF DEGREE  $k$  IT HOLDS

- HEAP PROPERTY

- HEIGHT IS  $k$

- ROOT HAS  $k$  CHILDREN

- THERE ARE  $2^k$  NODES

- REPRESENTATION

- ROOTS CAN BE IN LINKED LIST

- POINTER TO MIN (ALWAYS ROOT)

\* - MUST BE UPDATED IN  $O(\log n)$

- INSERT

- CREATE NEW HEAP OF ~~SAME~~ DEGREE 0 (ONE NODE)

- MERGE IT WITH CURRENT HEAP

- ACCESS MIN

- RETURN VALUE OF POINTER

- MERGE

- ADD HEAPS OF SAME DEGREES

- THERE CAN BE CARRY TO HIGHER DEGREE

- HEAP WITH SMALLER ROOT IS ROOT, THE SECOND IS APPENDED AS CHILD TO NEW ROOT

- UPDATE MIN POINTER

- DELETE MIN

- FIND TREE WITH MIN

- REMOVE MIN IN ROOT

- THIS CREATES NEW TREES OUT OF CHILDREN OF MIN

- MERGE NEW TREES WITH THE REST OF BINARY HEAP

- DECREASE KEY

- SAME AS IN BINARY HEAP

- DELETE

- DECREASE TO  $-\infty$

- DELETE MINIMUM IN HEAP BY DELETE MIN

- MERGE

-  $O(\log(n))$

- INSERT

-  $O(\log(n))$

- AMORTIZED  $O(1)$

- ACCESS\_MIN

-  $O(1)$

- DELETE\_MIN

-  $O(\log(n))$

- DECREASE\_KEY

-  $O(\log(n))$

- DELETE

-  $O(\log(n))$

## - AMORTIZED COMPLEXITY

- TIME TO PERFORM A SEQUENCE OF DATA-STRUCTURE OPERATIONS
- IT IS AVERAGED OVER ALL OPERATIONS PERFORMED
- WE CAN SHOW, THAT SEQUENCE OF OPERATIONS CAN BE FAST, EVEN IF SOME OPERATION IS EXPENSIVE

## - FIBONACCI HEAP

- LOOSELY BASED ON BINOMIAL HEAP
- HAVE MORE RELAXED STRUCTURE
- OPERATIONS NOT DELETING NODES RUNS IN  $O(1)$  AMORTIZED
- DELETE AND DELETE\_MIN RUNS IN  $O(\log(n))$  AMORTIZED
- BUT NOT SUITABLE FOR REAL TIME SYSTEMS
  - IN BAD CASES HAS LINEAR COMPLEXITY
- COLLECTION OF TREES WITH HEAP PRIORITY
  - IN EXTREME CASES EACH TREE HAS SINGLE NODE
  - THIS ALLOWS FOR LAZY EXECUTION OF OPERATIONS
    - MERGING CAN BE JUST CONCATENATION
    - DECREASING KEY SOMETIMES JUST CUTS THE NODE FROM ITS PARENTS



## - GRAPH ISOMORPHISM

- TWO GRAPHS  $G_1 = (V_1, E_1)$  AND  $G_2 = (V_2, E_2)$  ARE ISOMORPHIC IF THERE IS BIJECTION  $f: V_1 \rightarrow V_2$  SUCH THAT

$$\forall x, y \in V_1: \{f(x), f(y)\} \in E_2 \Leftrightarrow \{x, y\} \in E_1$$

- THE MAPPING  $f$  IS SAID TO BE ISOMORPHISM BETWEEN  $G_1$  AND  $G_2$

### - INVARIANT

- FUNCTION  $\Phi$

-  $\forall G_1, G_2 \in \mathcal{F}: \Phi(G_1) = \Phi(G_2) \Leftrightarrow G_1$  IS ISOMORPHIC TO  $G_2$

- NUMBER OF VERTICES

- SORTED LIST OF <sup>VERTEX</sup> DEGREES

### - CERTIFICATE

- FUNCTION SUCH THAT

$\forall G_1, G_2 \in \mathcal{F}: \text{CERT}(G_1) = \text{CERT}(G_2) \Leftrightarrow G_1$  IS ISOMORPHIC TO  $G_2$

### - TREE CERTIFICATE

- USE 0 1 ON LEAVES AND PROPAGATE TO ROOT

~~AND ADDEND LEFT~~

- USE LEXICOGRAPHICAL ORDER

- LENGTH IS  $2|V|$

- NUMBERS OF 1s AND 0s THE SAME

- RECONSTRUCT

- WITH 0 CREATE NEW NODE

- WITH 1 BACKTRACK

# - COMBINATORIAL ALGORITHMS

## - RANKING FUNCTION

### - BIJECTION

$$\text{RANK}: S \rightarrow \{0, \dots, |S| - 1\}$$

- UNRANK FUNCTION IS INVERSE TO RANK FUNCTION

- GIVEN RANKING FUNCTION RANK DEFINED ON S

THE SUCCESSOR FUNCTION SATISFIES THE FOLLOWING RULE

$$\text{SUCCESSOR}(s) = t \Leftrightarrow \text{RANK}(t) = \text{RANK}(s) + 1$$

### - USAGE

- STORING COMBINATORIAL OBJECTS INSTEAD OF COMBINATORIAL STRUCTURE

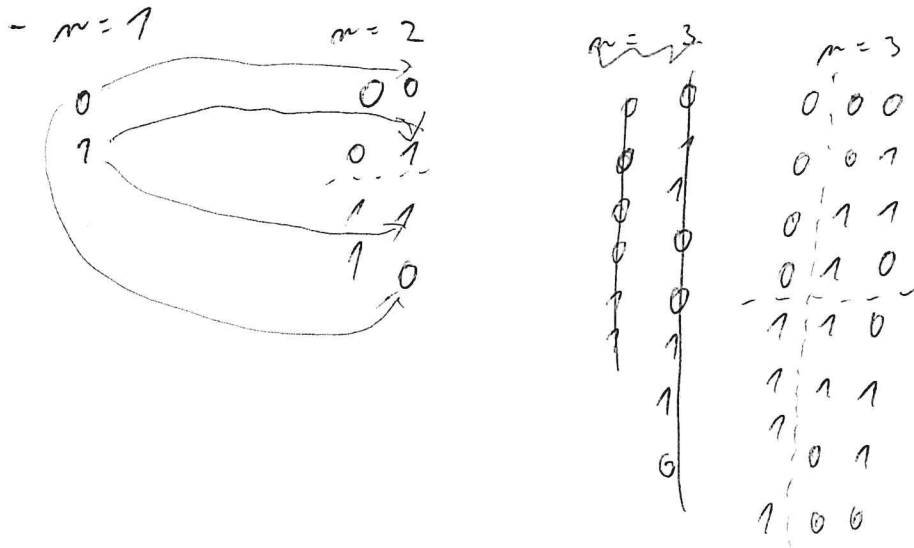
- GENERATION OF RANDOM OBJECT FROM S ENSURING EQUAL PROBABILITY  $\frac{1}{|S|}$

### - SUBSETS

T	$x(T) = [x_2, x_1, x_0]$	RANK(T)
$\emptyset$	[0 0 0]	0
{3}	[0 0 1]	1
{2}	[0 1 0]	2
{2,3}	[0 1 1]	3
{1}	[1 0 0]	4
{1,3}	[1 0 1]	5
{1,2}	[1 1 0]	6
{1,2,3}	[1 1 1]	7

- GRAY CODE

- TWO SUCCESSIVE VALUES DIFFERS ONLY IN SINGLE BIT



- PSEUDORANDOM NUMBER GENERATORS

- DETERMINISTIC FORMULA

- OUTPUT LOOKS RANDOM

- ALGORITHM WHICH PRODUCES A SEQUENCE

$$\{X_n\} = X_0, X_1, X_2, \dots$$

- IMPORTANT STATISTICAL PROPERTIES

- UNIFORMITY

- EACH NUMBER HAS THE SAME PROBABILITY

- NUMBER DRAWN BY PROBABILITY DENSITY FUNCTION

$$f(x) = \begin{cases} \frac{1}{b-a} & x \in [a, b] \\ 0 & \text{ELSEWHERE} \end{cases}$$

- INDEPENDENCE

- GOOD GENERATOR HAS LONG PERIOD  $b-a$  AND USES IT WHOLE

- AND IS FAST

- HAS EASY FORMULA

- TWO TASKS

- GENERATE NUMBER  $[a; b]$

- GENERATE NUMBER  $[0; 1]$

- WE CAN USE TASK 1 FOR TASK 2

- USE FORMULA  $\varphi(n) = \frac{x_{n-a}}{b-a-1}$

- LINEAR CONGRUENTIAL GENERATOR

$$0 \leq x_0 < M$$

$$x_{n+1} = (Ax_n + C) \text{ MOD } M \quad n \geq 0$$

- MAXIMUM PERIOD LENGTH

- LENGTH OF PERIOD IS MAXIMUM (EQUAL TO  $M$ ) IF ALL FOLLOWING HOLDS

1.  $C$  AND  $M$  ARE COPRIMES  $9 \neq \checkmark$   
 $9 \neq \times$

2.  $A-1$  IS DIVISIBLE BY EACH PRIME FACTOR OF  $M$

3. IF  $4$  DIVIDES  $M$  THEN ALSO  $4$  DIVIDES  $A-1$

- PROBLEM IS THAT LOW ORDER BITS HAS LACK OF RANDOMNESS

- GENERATES ODD, EVEN, ODD, EVEN, ODD, ...

- OR  $x_n \text{ MOD } 3 = 1, 0, 2, 1, 0, 2, 1, 0, 2, \dots$

- WE CAN IMPROVE IT BY OPERATION

$x_n \text{ MOD } W$  FOR SOME  $W < \max_{n \geq 0} \{x_n\}$

## - COMBINED LINEAR CONGRUENTIAL GENERATOR

- LET THERE BE  $r$  LINEAR CONGRUENTIAL GENERATORS

$$0 \leq x_{i,0} < m_i$$

$$x_{i,n+1} = (A_i x_{i,n} + C_i) \text{ MOD } m_i, n \geq 0$$

$$1 \leq i \leq r$$

- COMBINED LCG IS SEQUENCE  $\{x_n\}$  DEFINED BY

$$x_n = (x_{1,n} - x_{2,n} + x_{3,n} - x_{4,n} + \dots + (-1)^{r-1} x_{r,n}) \text{ MOD } (m_1 - 1), n \geq 0$$

- MAXIMUM POSSIBLE PERIOD LENGTH IS

$$(m_1 - 1)(m_2 - 1) \dots (m_r - 1) / 2^{r-1}$$

- BUT IT IS NOT ALWAYS ATTAINED

## - LEMPER GENERATOR

$$0 < x_0 < m \quad x_0 \text{ COPRIME TO } m$$

$$x_{n+1} = Ax_n \text{ MOD } m \quad n \geq 0$$

- SEQUENCE PERIOD LENGTH IS MAXIMAL AND EQUALS TO  $m-1$  IF

-  $m$  IS PRIME

-  $A$  IS A PRIMITIVE ROOT OF THE MULTIPLICATIVE GROUP OF INTEGERS MODULO  $m$

- THERE IS NO EFFECTIVE WAY KNOWN NOW TO FIND IT

- BUT SPECIAL CASES HAVE BEEN STUDIED

- BLUM BLUM SHUB GENERATOR

$$2 \leq x_0 < M \quad x_0 \text{ COPRIME TO } M$$

$$x_{n+1} = x_n^2 \text{ MOD } M$$

-  $M$  IS A PRODUCT OF TWO BIG PRIMES  $P$  AND  $Q$

- PRIMES COUNTING FUNCTION

-  $\pi(n)$

- COUNTS NUMBER OF PRIMES LESS THAN OR EQUAL TO  $n$

$$\pi(10) = 4 : 2, 3, 5, 7$$

- ESTIMATE

$$\frac{n}{\ln(n)} < \pi(n) < 1.2506 \frac{n}{\ln n} \quad \text{FOR } n > 16$$

- LIMIT BEHAVIOUR

$$\lim_{n \rightarrow \infty} \frac{\pi(n)}{\frac{n}{\ln n}} = 1$$

- EULER'S TOTIENT FUNCTION  $\phi(n)$

- COUNTS INTEGERS LESS THAN OR EQUAL TO  $n$  THAT ARE RELATIVELY PRIME TO  $n$

$$\phi(21) = 12 : 1, 2, 4, 5, 8, 10, 11, 13, 16, 17, 19, 20$$

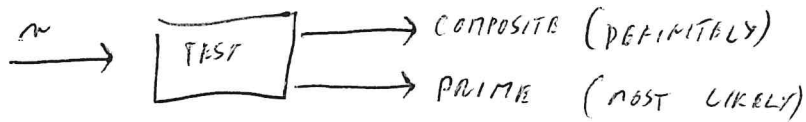
- MERSENNE PRIME  $M_n$

- PRIME IN FORM  $2^n - 1$

$$n=3 \quad M_3 = 2^3 - 1 = 7$$

$$n=7 \quad M_7 = 2^7 - 1 = 127$$

## - RANDOMIZED PRIMALITY TESTS



## - FERMAT LITTLE THEOREM

- IF  $p$  IS PRIME AND  $0 < a < p$  THEN

$$a^{p-1} \equiv 1 \pmod{p}$$

## - FERMAT PRIMALITY TEST

FOR  $n$ :

$a =$  RANDOM INT  $[2, n-2]$

IF  $a^{n-1} \not\equiv 1 \pmod{n}$  THEN COMPOSITE

RETURN PRIME

- BUT THERE ARE INFINITELY MANY COMPOSITE NUMBERS FAILING THIS TEST ALWAYS

## - MILLER-RABIN PRIMALITY TEST

- IF  $p$  IS PRIME AND  $x^2 \equiv 1 \pmod{p}$

- THEN  $x \equiv 1 \pmod{p}$  OR  $x \equiv -1 \pmod{p}$

- LET  $n > 2$  BE PRIME  $n-1 = 2^r \cdot d$  WHERE  $d$  IS ODD,  $1 < a < n-1$   
 THEN EITHER  $a^d \equiv 1 \pmod{n}$  OR  $a^{2^s \cdot d} \equiv -1 \pmod{n}$  FOR SOME  $0 \leq s < r$ .

## - ALGORITHM

COMPUTE  $r, d$  SUCH THAT  $d$  IS ODD AND  $2^r \cdot d = n-1$

FOR  $i = 1$  TO  $k$

$a =$  RANDOM INTEGER IN  $[2, n-2]$

$x = a^d \pmod{n}$

IF  $x = 1$  OR  $x = n-1$  THEN GOTO END OF LOOP

FOR  $j = 1$  TO  $r-1$

$x = x^2 \pmod{n}$

IF  $x = 1$  THEN RETURN COMPOSITE

IF  $x = n-1$  THEN GOTO END OF LOOP  
 RETURN PRIME

- TIME COMPLEXITY :  $O(n \log^3 n)$

- IF  $n$  IS COMPOSITE, THEN TEST DECLARES  $n$  AS PRIME WITH PROBABILITY AT MOST  $\frac{1}{2^n}$

- AKS PRIMALITY TEST

- FIRST KNOWN DETERMINISTIC POLYNOMIAL-TIME PRIMALITY TEST

- TIME COMPLEXITY  $O(\log^6 n)$

- BIG THEORETICAL IMPORTANCE, BUT NOT USED IN PRACTICE

- FINITE AUTOMATA

- ALPHABET

- FINITE SET OF SYMBOLS

- WORD

- FINITE SEQUENCE OF SYMBOLS OF ALPHABET

- LANGUAGE

- SET OF WORDS

- SPECIFIED BY

- LISTING ALL THE WORDS

- BUT MAY BE INFINITE SET

- DESCRIPTION OF HUMAN LANGUAGE

- BY FINITE AUTOMATON

- 5-TUPLE  $(A, Q, \delta, S_0, Q_F)$

$A$  - ALPHABET

$Q$  - SET OF STATES

$\delta$  - TRANSITION FUNCTION  $\delta: Q \times A \rightarrow Q$

$S_0$  - START STATE

$Q_F$  - SET OF FINAL STATES (ACCEPT)  $Q_F \subseteq Q$

- IF LAST SYMBOL IS READ AND AUTOMATON TRANSITION TO FINAL STATE, THE WORD IS ACCEPTED

- OTHERWISE IT IS NOT ACCEPTED



- LANGUAGE ACCEPTED BY AUTOMATON

- SET OF ALL WORDS ACCEPTED BY IT

- NON-DETERMINISTIC FINITE AUTOMATA

- DIFFERENCE IS IN TRANSITION FUNCTION

$$\delta : Q \times \Sigma \rightarrow P(Q) \quad \text{WHERE } P(Q) \text{ IS POWerset OF } Q$$

- CAN TRANSITION TO SEVERAL STATES AT ONCE

- IT CAN BE TRANSFORMED INTO DFA

- EACH STATE OF DFA IS SUBSET OF STATES OF NFA (EMPT SET  $\emptyset$ )

- STATE OF DFA IS ~~ALSO~~ FINAL STATE IF IT CONTAINS SOME FINAL STATE OF NFA

- TEXT SEARCH

- NAIVE

- WE HAVE PATTERN

- WE COMPARE SYMBOLS OF PATTERN TO TEXT

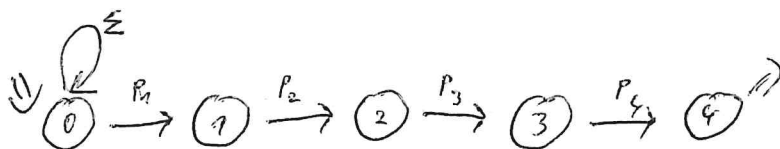
- IF MISMATCH OCCURS, WE SHIFT THE PATTERN BY ONE POSITION

TEXT	a	b	c	d	e	f
PATTERN	a	b	c	x		
	✓	✓	✓	X		

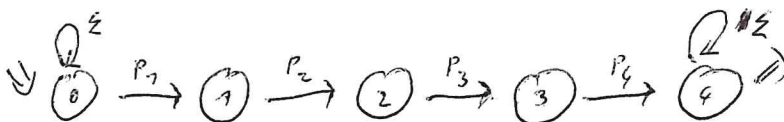
- NFA



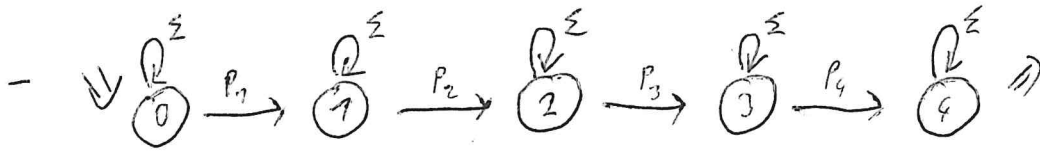
- ACCEPTS WORD P<sub>1</sub>P<sub>2</sub>P<sub>3</sub>P<sub>4</sub> EXACTLY



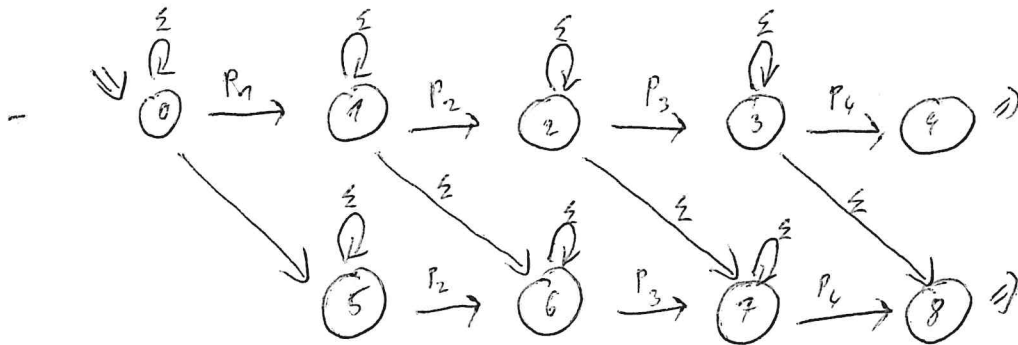
- ACCEPTS WORD WITH SUFFIX P<sub>1</sub>P<sub>2</sub>P<sub>3</sub>P<sub>4</sub>



- ACCEPTS WORD WITH SUBSTRING P<sub>1</sub>P<sub>2</sub>P<sub>3</sub>P<sub>4</sub> ANYWHERE IN IT



- ACCEPTS WORD WITH SUBSEQUENCE  $P_1 P_2 P_3 P_4$  ANYWHERE IN IT



- ACCEPTS WORD WITH SUBSEQUENCE  $P_1 P_2 P_3 P_4$  ANYWHERE IN IT AND THE SEQUENCE CAN BE ALTERED BY ONE SYMBOL (HAMMING DISTANCE IS ~~4~~ 1 AT MOST)

- ONLY LANGUAGES ABLE TO BE PROCESSED BY NFA/DFA ARE REGULAR LANGUAGES

- FOR EXAMPLE LANGUAGE OF WELL FORMED PARENTHESES IS NOT REGULAR (IT IS CONTEXT FREE)

- OPERATIONS ON ~~AND~~ REGULAR LANGUAGES

-  $L_1 \cup L_2$

- SET OF ALL WORDS WHICH ARE IN  $L_1$  OR  $L_2$

-  $L_1 \cdot L_2$

- CONCATENATION

- OR ALL WORDS  $w = w_1 w_2$ ,  $w_1 \in L_1$ ,  $w_2 \in L_2$

-  $L_1^*$

- KLEENE STAR

- CONCATENATION OF ANY WORD OF  $L_1$

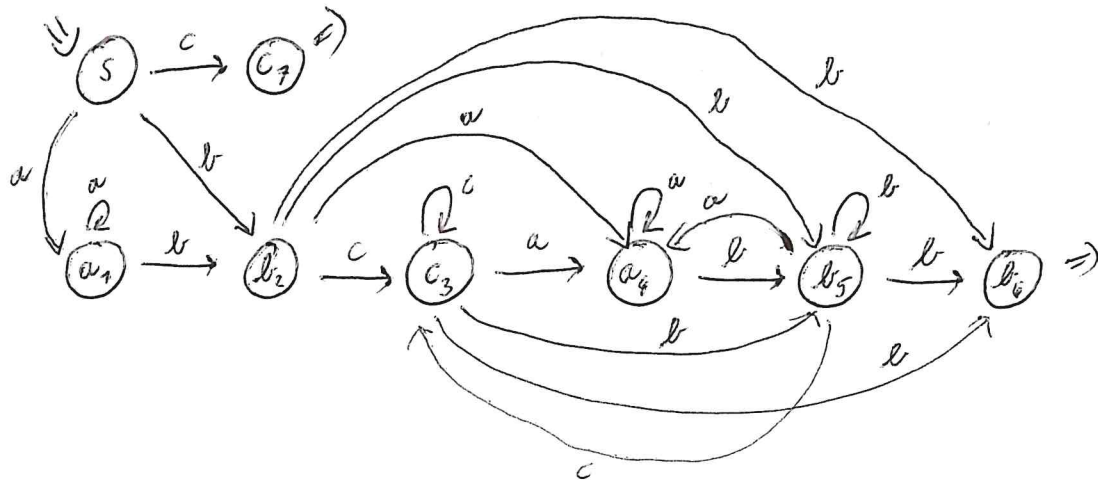
- ALL OF THESE OPERATIONS CREATES REGULAR LANGUAGES TOO

- REGULAR EXPRESSION TO NFA

$$a^*b(c+a^*b)^*b+c$$

- ADD INDICES

$$a_1^*b_2(c_3+a_4^*b_5)^*b_6+c_7$$

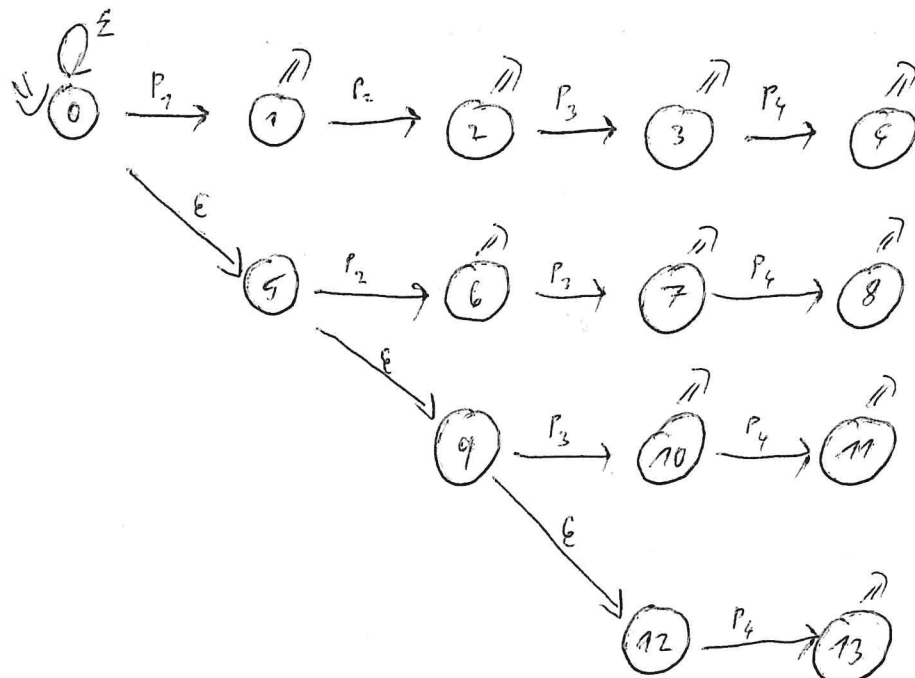


- WE CAN ADD  $\epsilon$  TRANSITIONS

-  $\epsilon$ -CLOSURE (P)

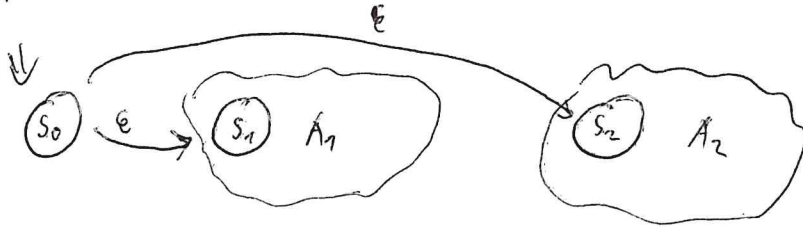
- SET OF ALL STATES WHICH CAN BE ACCESSED FROM P BY USING ONLY  $\epsilon$ -TRANSITIONS

- BUT WE CAN ALWAYS CONSTRUCT EQUIVALENT NFA WITHOUT  $\epsilon$ -TRANSITIONS

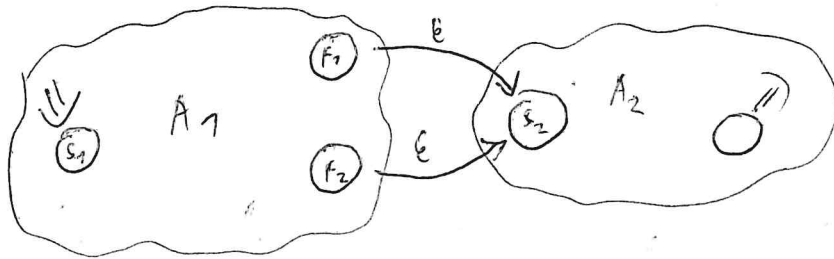


- ACCEPTS ANY UNEQUAL SUBSTRING OF PATTERN  $P_1P_2P_3P_4$  OVER ALPHABET  $\Sigma$

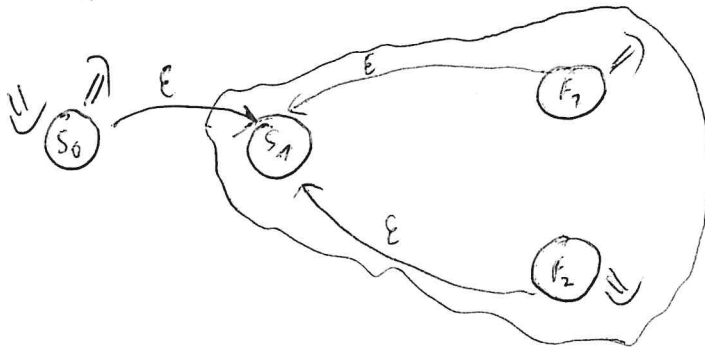
- AUTOMATON ACCEPTING UNION OF  $L_1$  AND  $L_2$



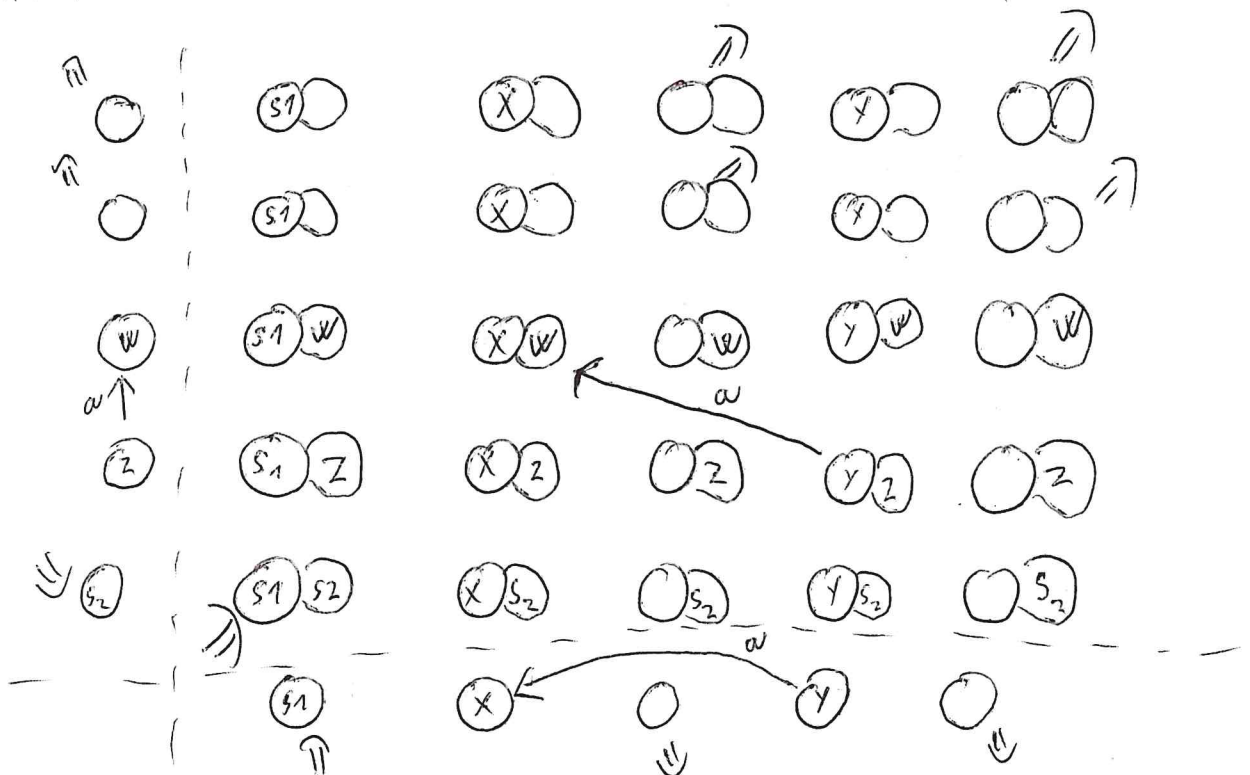
- AUTOMATON ACCEPTING CONCATENATION OF  $L_1$  AND  $L_2$



- AUTOMATON ACCEPTING ITERATION OF LANGUAGE  $L_1$



- AUTOMATON ACCEPTING INTERSECTION OF  $L_1$  AND  $L_2$



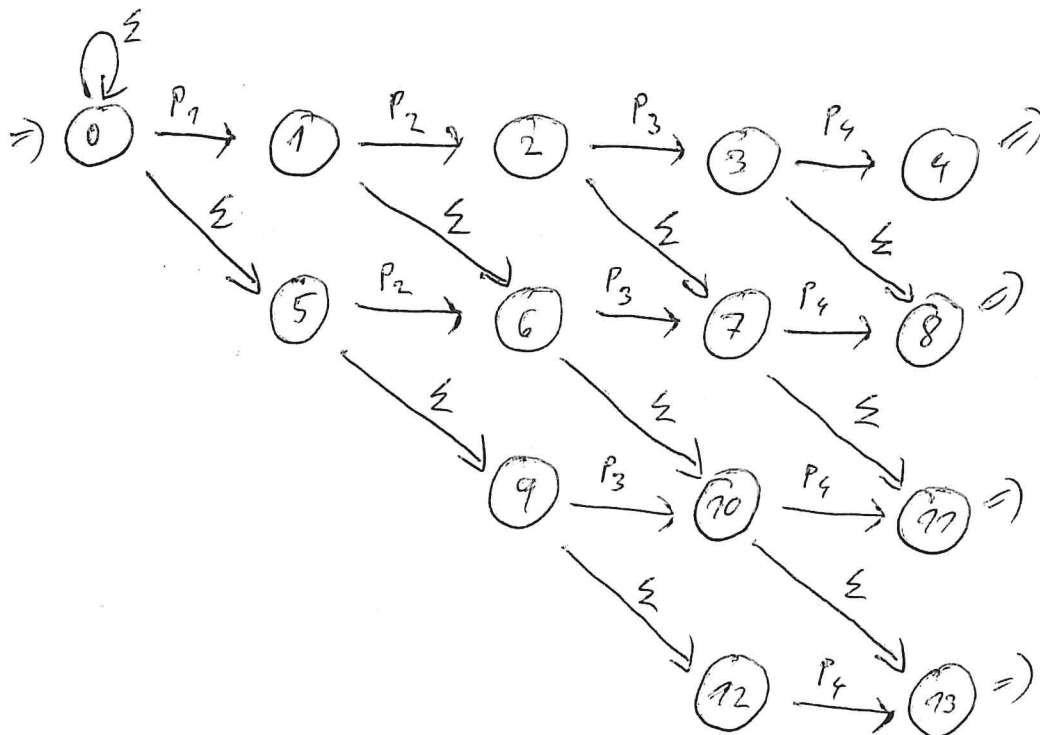
# - HAMMING DISTANCE

- MINIMAL NUMBER OF REWRITE OPERATIONS WHICH REWRITES ONE STRING INTO OTHER
- WE CAN'T INSERT OR DELETE CHARACTERS
- DEFINED ONLY FOR STRINGS OF THE SAME LENGTH

- 

L	O	K	O	M	O	T	I	V	A
V	Y	K	O	L	E	J	I	L	A

DISTANCE = 6



- DETECT STRING WITH ~~MIN~~ HAMMING DISTANCE MAXIMAL  $\times 3$
- WE CAN IMPROVE IT BY DETECTING  $\bar{P}_i$  INSTEAD OF  $\zeta$  ON DIAGONAL LINES

# - LEVENSHTEIN DISTANCE

- NUMBER OF EDIT OPERATION TRANSFORMING STRING A TO B

- OPERATIONS REMOVE, INSERT, REWRITE

- STRINGS CAN BE OF DIFFERENT LENGTH

- THE EXACT USED OPERATIONS CAN VARY, BUT THE DISTANCE IS JUST ONE

- BRUXELLES DELETE X

BETELGEUSE REWRITE R → E, U → T, L → G

INSERT U, E

- CAN BE CALCULATED BY DYNAMIC PROGRAMMING

IF ~~IF~~  $A[i] == B[j]$

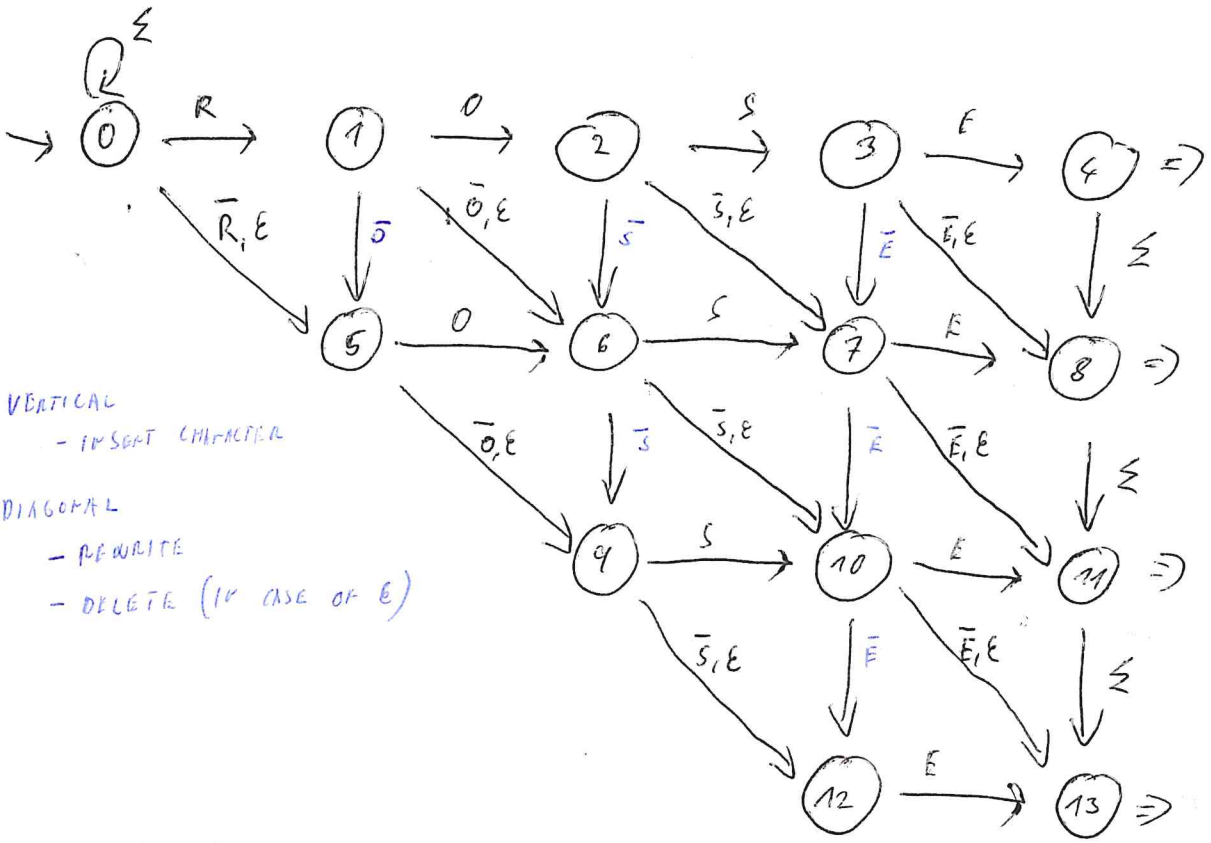
$$D[i][j] = D[i-1][j-1]$$

ELSE

$$D[i][j] = 1 + \min(D[i-1][j-1], D[i-1][j], D[i][j-1])$$

	B	E	T	E	L	G	E	U	S	E	
0	1	2	3	4	5	6	7	8	9	10	
B	1	0	1	2	3	4	5	6	7	8	9
R	2	1	1	2	3	4	5	6	7	8	9
U	3										
X	4										
E	5										
L	6										
L	7										
E	8										
S	9										

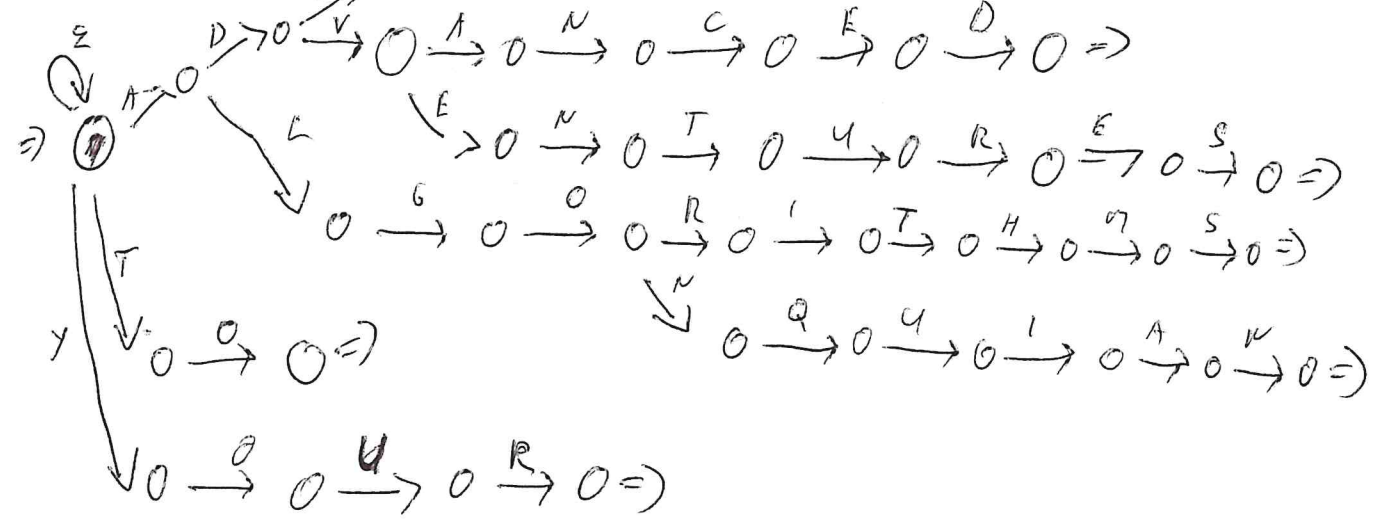
6



- VERTICAL
  - INSERT CHARACTER
- DIAGONAL
  - REWRITE
  - DELETE (IN CASE OF E)

- FINDS ~~STRINGS~~ STRINGS IN TEXT WITH LEVENSHTAIN DISTANCE MAX 3 FROM "ROSE"

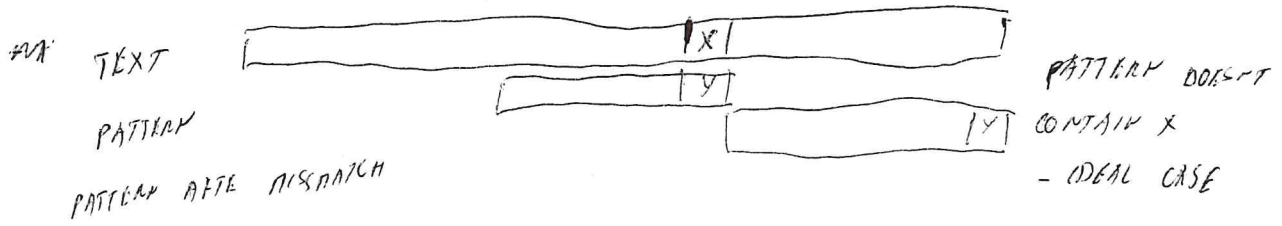
- DICTIONARY DFA



- TRANSFORMATION TO DFA DOESN'T INCREASE NUMBER OF STATES

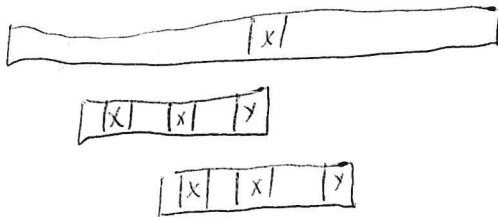
- BOYER - MOORE TEXT SEARCH

- START THE SEARCH FROM THE END OF PATTERN



- IF X IS IN PATTERN

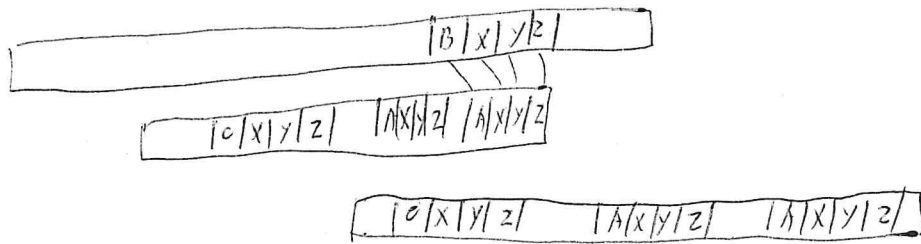
- SHIFT BY ~~BY~~ BAD CHARACTER SHIFT VALUE IN TABLE



- IF MISMATCH APPEARS IN THE MIDDLE OF PATTERN

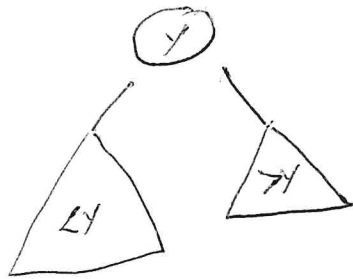
- SITUATION COMPLICATED

- SHIFT TO NEXT OCCURRENCE OF SUFFIX IN PATTERN

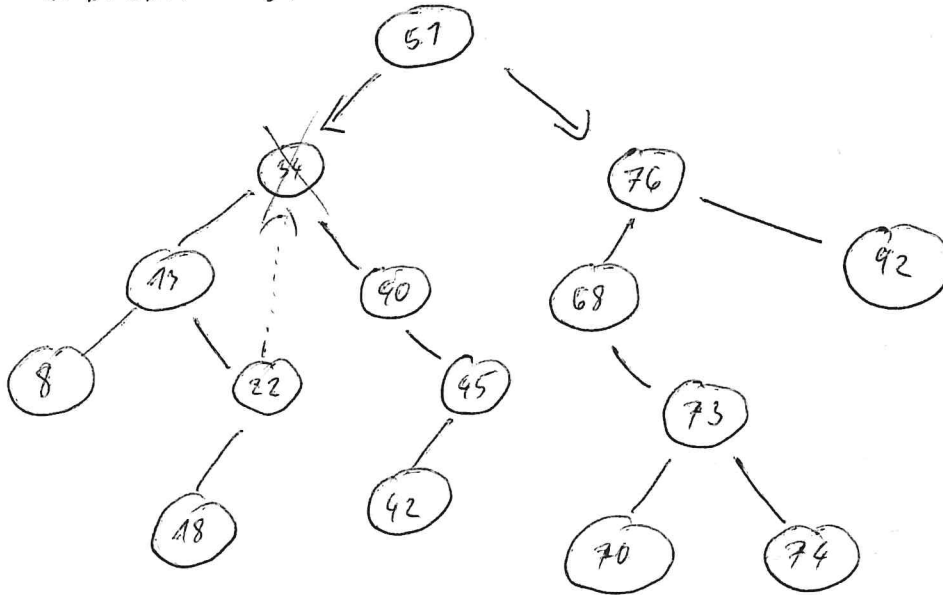




- BINARY SEARCH TREE



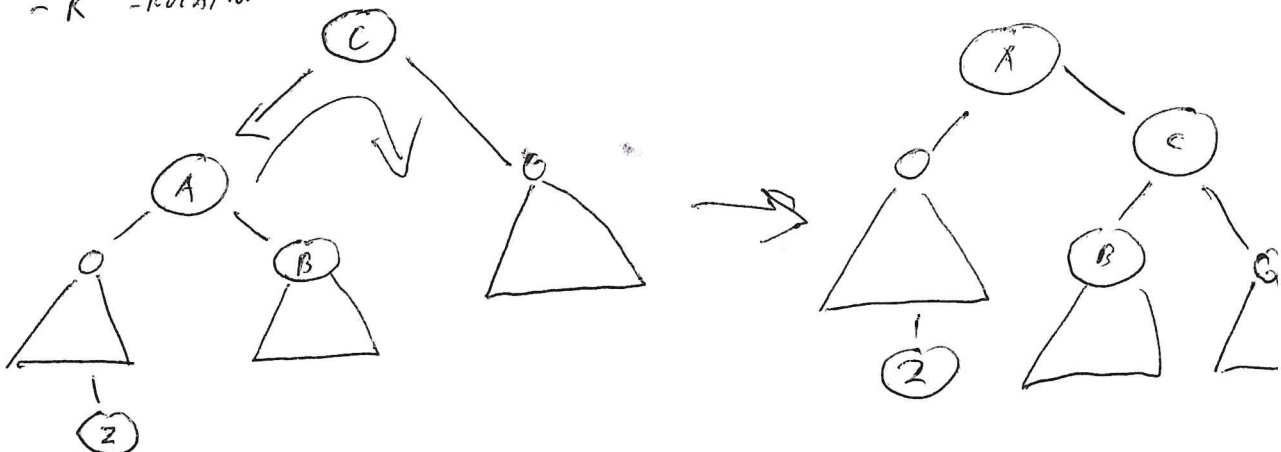
- DELETE 34



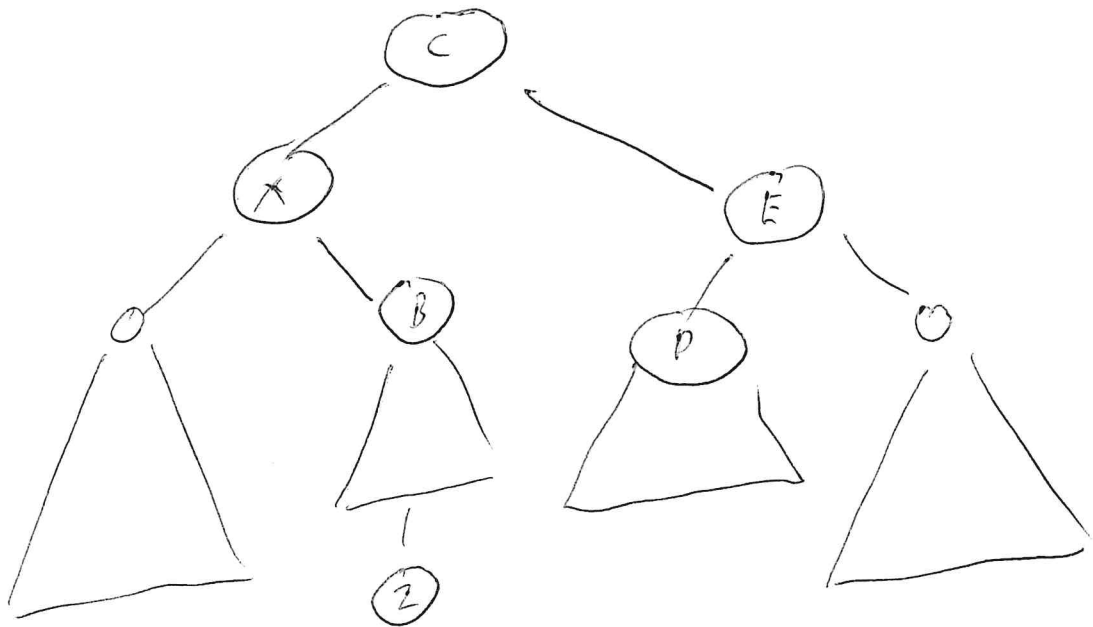
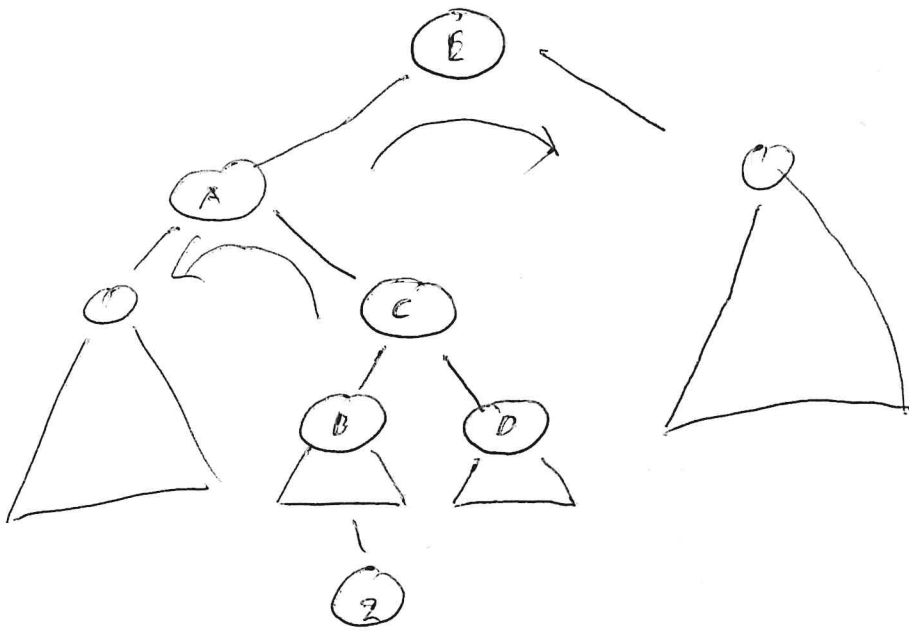
- AVL

- KEEPS BALANCED
- DEPTH OF LEFT AND RIGHT CHILD
- ROTATE IF  $L-R \geq 2$

- R - ROTATION



- LR ROTATION

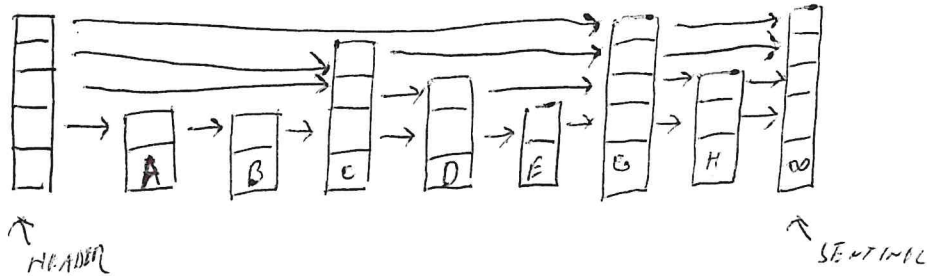


- SKIP - LIST

- LINKED LIST WITH  $\log(n)$  SEARCH

- SORTED

- EACH NODE CONTAINS VARIABLE NUMBER OF LINKS



- LEVEL OF NODE IS SELECTED BY RANDOM

- FLIP A COIN

- INCREASE THE VALUE UNTIL YOU OBSERVE THE TAIL

- YOU CAN ALSO SELECT DIFFERENT PROBABILITY

- SEARCH

- START IN HIGHEST LEVEL

- TRAVERSE UNTIL  $node > search$

- IF SO BACK TRACK AND GO ONE LEVEL DOWN

- INSERT

- SAME AS SEARCH

- ~~ONE~~ DETERMINE LEVEL

- ADD NEW CONNECTIONS

- CHOOSING  $P$

- 0,5

-  $\log(N)$  SEARCH TIME

- 2 POINTERS PER NODE

- 0,25

- EMPIRICALLY TESTED

- ROUGHLY SAME SEARCH TIME

- BUT ONLY 1,33 POINTERS PER NODE

- SEARCH TIME CAN VARY

- BUT MEMORY SAVINGS ARE WORTH IT

- AVERAGE NUMBER OF LINKS IS

$$N \cdot \frac{1}{1-P}$$

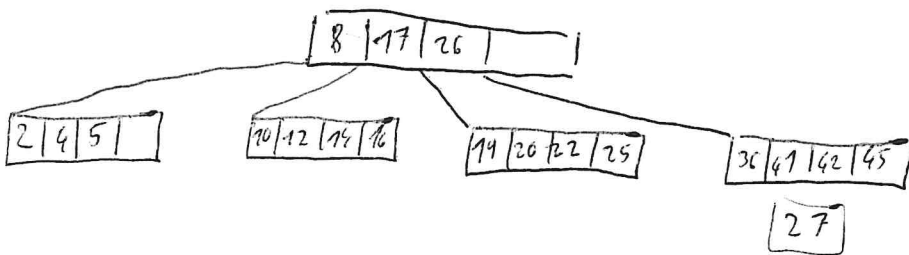
- TIME COMPLEXITY OF SEARCH, INSERT, AND DELETE ARE

$$O(\log n)$$

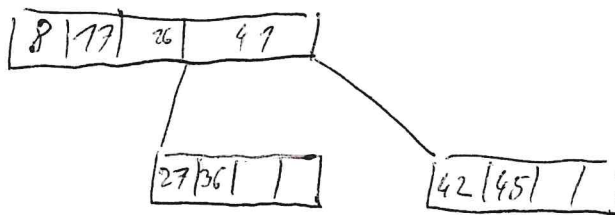
-  $P$  CAN CHANGE THE VARIABILITY OF SEARCH TIME

# B-TREE

- ALL LENGTHS OF PATHS ARE EQUAL
- PERFECTLY BALANCED
- SAME SIZE OF ALL NODES
- EACH NODE (EXCEPT ROOT) CONTAINS  $[2r, 2r]$  KEYS
- ALSO IT HAS  $[2r+1, 2r+1]$  CHILDREN
- MULTI PHASE STRATEGY
  - INSERT 27



- SORT (41)
- SELECT MEDIAN (27)
- DIVIDE NODE
- MEDIAN UP



- IF NECESSARY DO RECURSIVELY UP

## - DELETE

- LEAF ENOUGH CAPACITY
  - OK
- INNER NODE ENOUGH CAPACITY
  - SUBSTITUTE BY SMALLEST BIGGER VALUE

- DELETE TOO SMALL CAPACITY

- REMOVE VALUE

- MERGE WITH KEY

- SELECT MEDIAN  $\rightarrow$  NEW KEY

- SINGLE PHASE STRATEGY

- GOES FROM ROOT TO LEAVES

- B+ TREE

- ANALOGOUS TO B-TREE

- RECORDS (ACTUAL VALUES) ARE STORED ONLY IN LEAVES

- INTERNAL NODES ONLY GUIDES THE SEARCHES

- LEAVES CONNECTED TOGETHER

- FORMS LINKED LIST

- INFORMATION CAN BE RETRIEVED SEQUENTIALLY TOO

- CAN SUPPORT RANGE-SEARCH QUERIES

- EACH NODE VALUES WAS KEYS ONCE (WHEN VALUE WAS ADDED)

- IF THE VALUE IS DELETED, THE NODE LIVES ON

- COMPLEXITY

- FIND, INSERT, DELETE

$$- \Theta(b \log_b n)$$

-  $n$  IS NUMBER OF ELEMENTS IN TREE

-  $b$  IS BRANCHING FACTOR

- RANGE SEARCH

$$\Theta\left(b \log_b n + \frac{k}{b}\right)$$

-  $k$  IS RANGE OF QUERY

## - SPLAY TREE

- DATA WHICH WAS ACCESSED RECENTLY WILL PROBABLY BE ACCESSED AGAIN

- ACCESSED NODES ARE SPLAYED (ROTATED) TO THE ROOT

- FIND

- FIND NODE AND SPLAY IT TO ROOT

- INSERT

- INSERT NODE AND SPLAY IT TO ROOT

- DELETE

- SPLAY TO ROOT AND DELETE IT

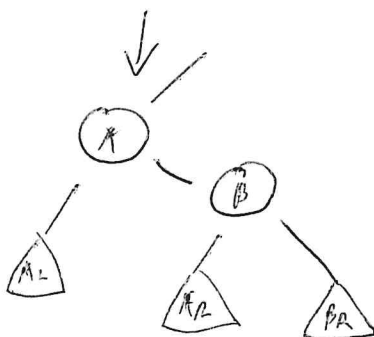
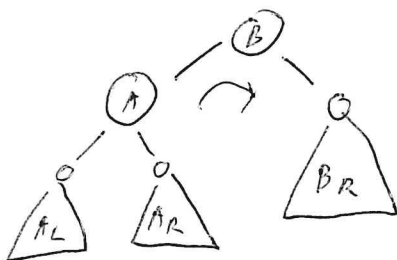
- ZIG, ZIG-ZIG AND ZIG-ZAG ROTATIONS

- OPERATION TIMES ARE  $O(n)$ , TREE HEIGHT CAN BE  $\Theta(n)$

- AMORTIZED RUN OF ALL OPERATIONS IS  $O(\ln(n))$

- ZIG

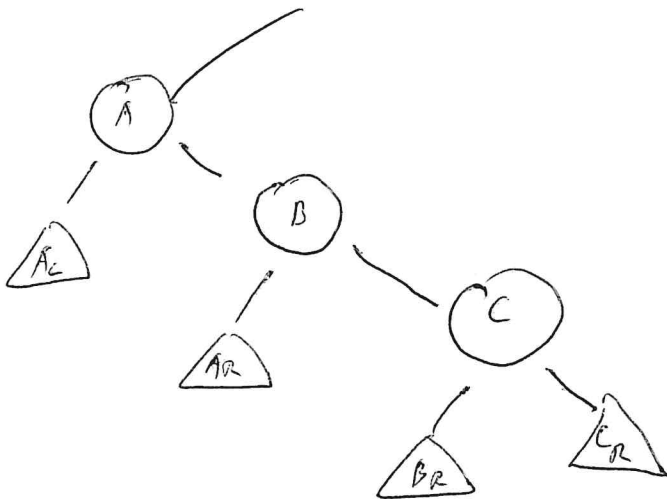
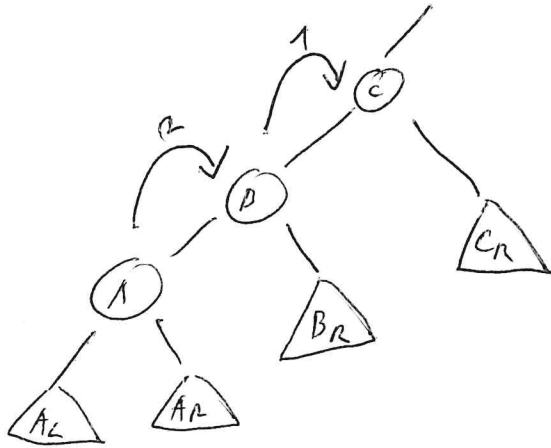
- AS L OR R ROTATIONS



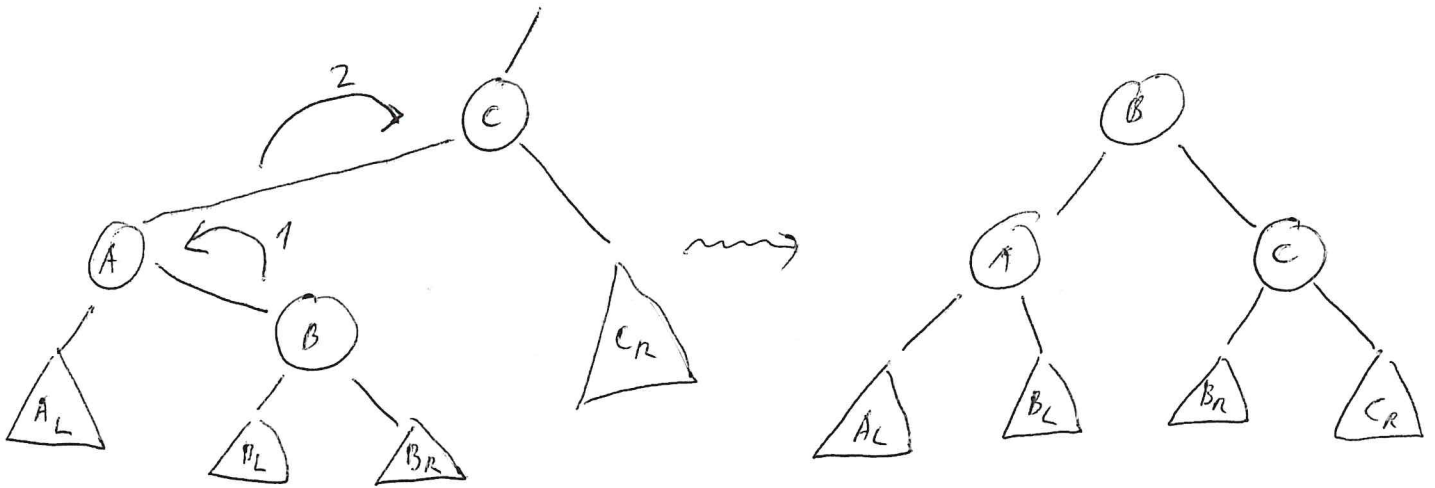
- 216 - 216

- AS RR

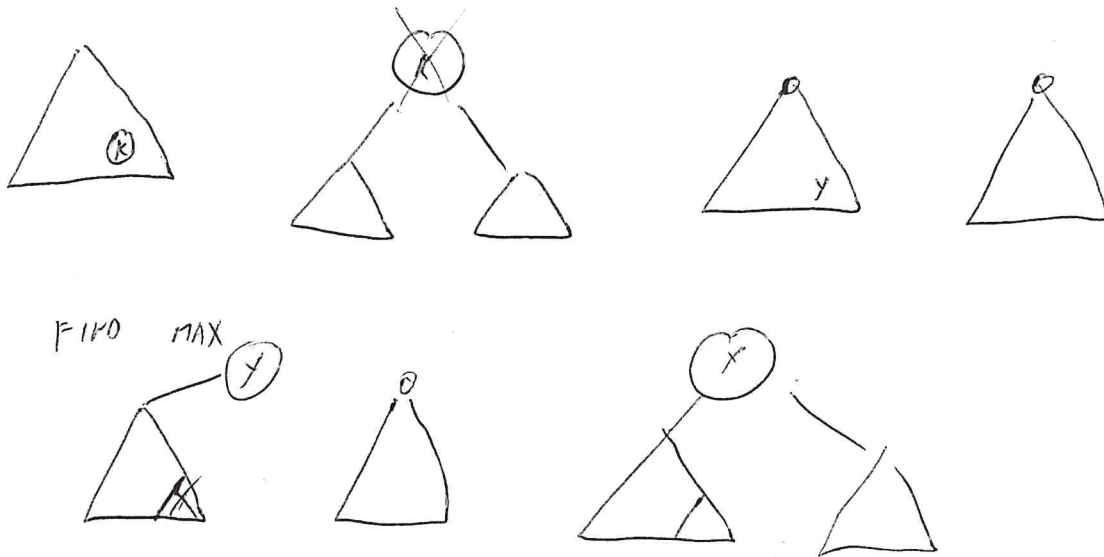
- OR LL







- DELETE



- RUN OF SPLAY TREE IS COMPARABLE TO ANY BALANCED TREE IF  $n$  OPERATIONS ARE PERFORMED

- ADVANTAGES

- AMORTIZED RUNE TIMES ARE SIMILAR TO AVL OR R-B TREES
- EASIER IMPLEMENTATION
- NO ADDITIONAL INFORMATIONS (LIKE DEPTHS IN AVL)

- DISADVANTAGE

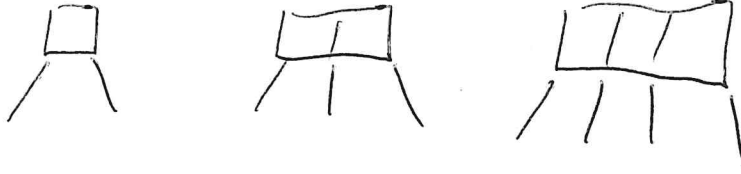
- TREE CHANGES WITH READ ONLY OPERATIONS

# - 2-3-4 TREE

- LIKE B-TREE WITH MIN DEGREE 2 AND MAX 4

- NODES ARE

- 2, 3, 4 (NUMBER OF CHILDREN)



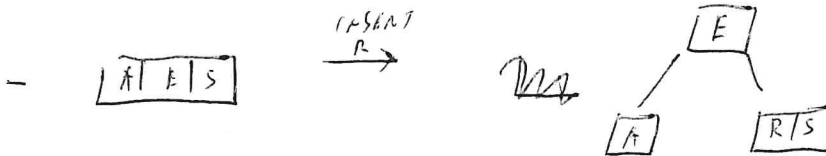
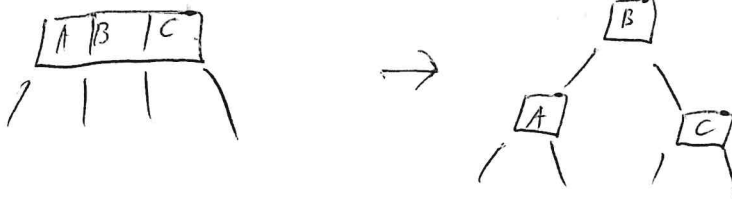
- FIND WORDS AS IN B-TREE

- INSERT \_\_\_\_\_ // \_\_\_\_\_  
- DELETE \_\_\_\_\_ // \_\_\_\_\_  
- SPLITTING STRATEGY

- IF WE REACH 4-NODE

- SPLIT INTO 2 2-NODES

- MOVE MIDDLE ELEMENT TO PARENT



## - COMPARISON OF TREES

- IF RANDOM ORDER INPUT

- BEST IS UNBALANCED BST

- IF RANDOM ORDER INPUT AND SOMETIMES SORTED

- RED-BLACK TREE

- IF SORTED ORDER AND THEN RANDOM ACCESS

- AVL

- IF SORTED ORDER AND THEN CLUSTERED OR SEQUENTIAL ACCESS

- SPLAY TREE

## - RED-BLACK TREE

- APPROXIMATELY BALANCED BST

- HEIGHT  $\leq 2 \times$  HEIGHT OF BALANCED TREE

- STORES BIT TO MARK COLOR OF NODE

- PROPERTIES

- EACH NODE IS RED OR BLACK

- EACH NULL (LEAF) IS BLACK

- IF NODE IS RED, BOTH CHILDREN IS BLACK

- EVERY SIMPLE PATH FROM NODE TO DESCENDANT LEAF CONTAINS THE SAME NUMBER OF BLACK NODES

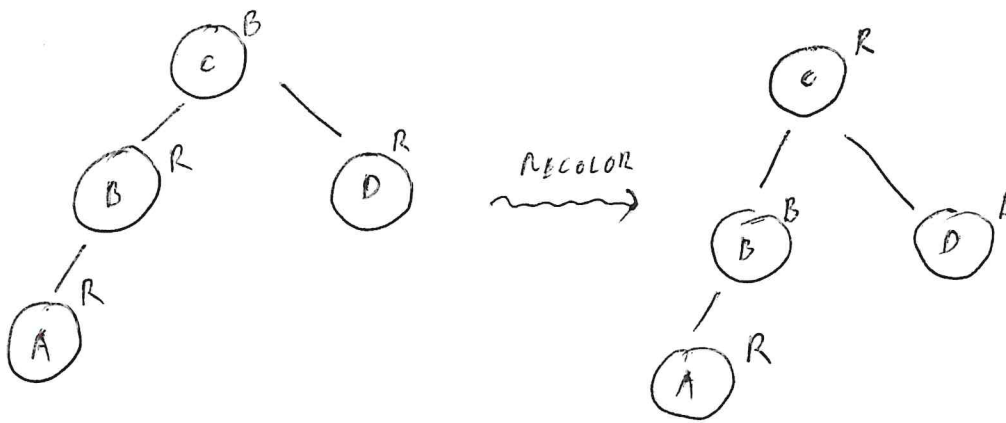
- ROOT IS BLACK

- SEARCH IS THE SAME AS IN BST

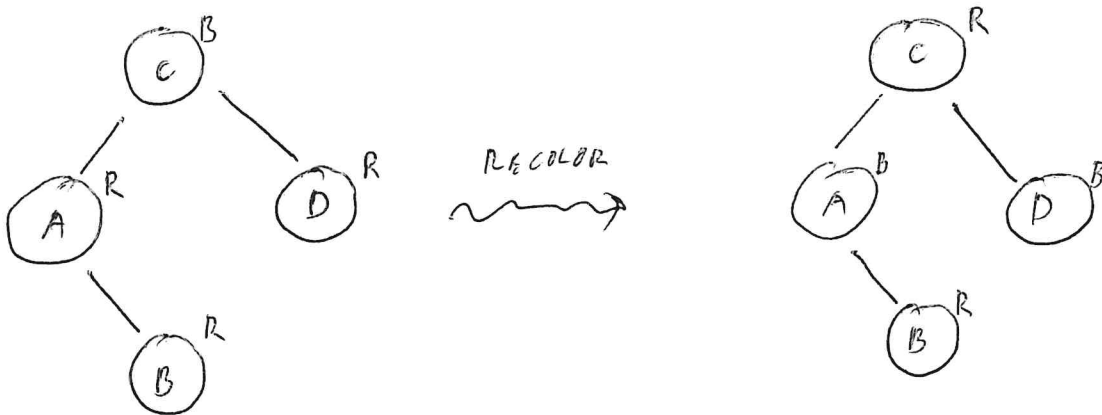
# INSERT

- NEW NODE IS RED
- ADD IT AS TO STANDARD BST
- IF PARENT OF NEW NODE IS BLACK
  - STOP
- IF PARENT OF NEW NODE IS RED

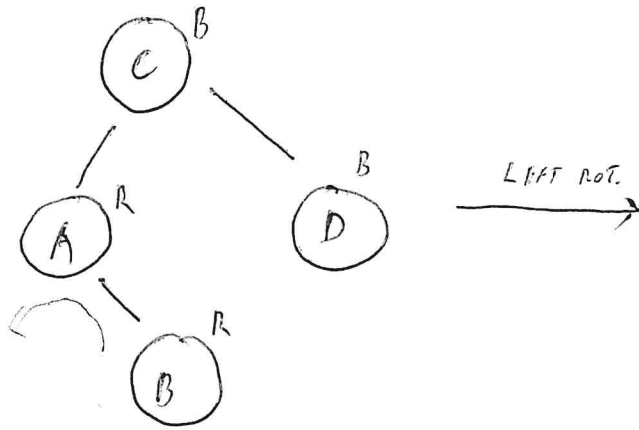
## CASE 1a



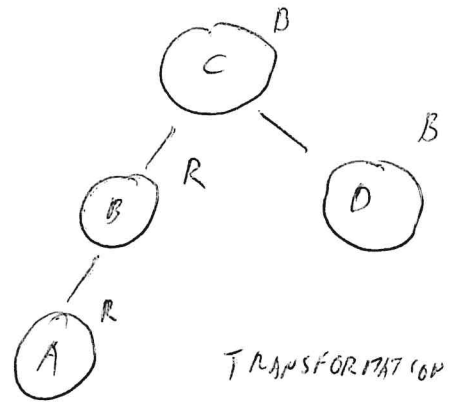
## CASE 1b



CASE 2

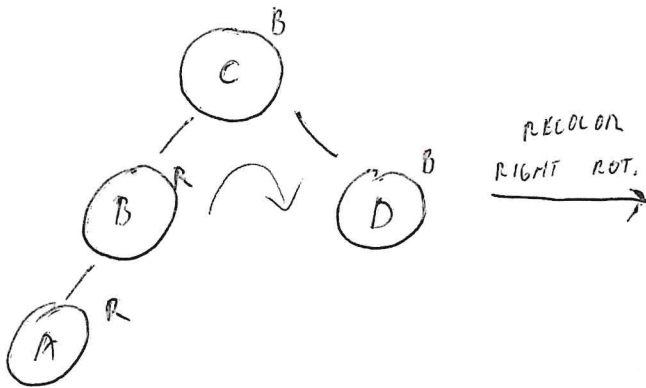


LEFT ROT.

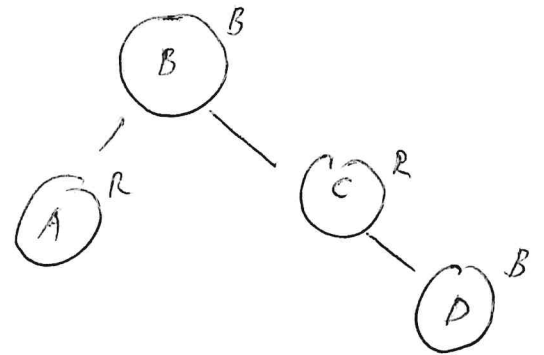


TRANSFORMATION TO  
CASE 3

CASE 3



RECOLOR  
RIGHT ROT.



- INSERTION IN  $\Theta(\log(n))$  TIME

- REQUIRES MAX. TWO ROTATIONS

# - DELETE

- DELETE AS IN CASE OF BST

- IF NODE IS RED

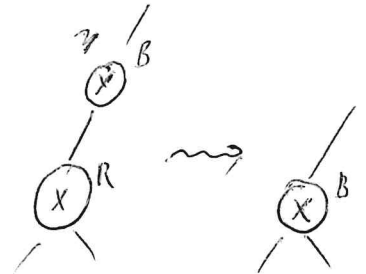
- ALL OK

- IF BLACK NODE WAS DELETED

- CHILD OF DELETED NODE IS ~~BLACK~~ RED

- RECOLOR IT TO RED

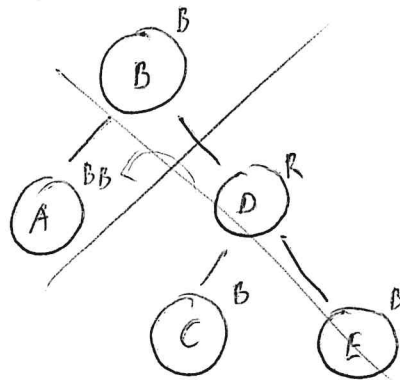
- STOP



- CHILD OF DELETED NODE IS BLACK

- MARK CHILD AS DOUBLE BLACK

- CASE VIA FIVE CASES



- COMPLEXITY IS  $\Theta(\log(m))$

- AFTER THREE ROTATIONS ARE DONE

## - KD-TREES

- SEARCH TREE IN D DIMENSIONS
- SPACE DIVIDED INTO RECTANGULAR CELLS
- FIND IS ANALOGOUS TO 1D VARIANT
  - CUTTING DIMENSIONS ALTERNATE
- INSERT IS ANALOGOUS TO 1D VARIANT
- FIND MIN OF  $k$ -TH DIMENSION
  - NO EASY WAY HOW TO KEEP TRACK OF IT
  - MOST COSTLY OPERATION
    - COMPLEXITY  $O(n^{1-\frac{1}{d}})$   $n$  - NODES  
 $d$  - DIMENSIONS
- MIN OF  $y$  COORDINATE CAN BE IN BOTH HALVES OF CUT BY  $x$  COORDINATE
  - BOTH MUST BE SEARCHED

## - DELETE

- ONLY LEAVES ARE PHYSICALLY DELETED
- ~~DO~~ IF REMOVE INNER NODE CUTTING BY  $k$  DIMENSION, FIND NODE WITH SMALLEST ~~IN~~ VALUE ~~IN~~  $k$  DIMENSION ~~IN~~ IN RIGHT SUBTREE AND REPLACE DELETED NODE BY IT
  - RUN DELETE ON NODE ~~DELETED~~ WHICH IS SUBSTITUTE

## - NEAREST - NEIGHBOR SEARCH

- RUNS RECURSIVELY IN BOTH L AND RIGH SUBTREES OF ACTUAL NODE
- REGISTER AND UPDATE PARTIAL RESULTS
- PERFORMS PRUNING DURING SEARCH
- COMPLEXITY CAN BE  $O(m)$  WHEN DATA IS UNFAVORABLY ARRANGED
  - HIGH NUMBER OF DIMENSIONS (7, 8... 10006)
  - ARRANGEMENT OF POINTS IN LOW DIMENSION IS SPECIAL (ARTIFICIALLY CONSTRUCTED)
- EXPECTED TIME IS  $O(2^D \log m)$  WITH UNIFORMLY DISTRIBUTED DATA
- IT IS EFFECTIVE ONLY WHEN  $2^D$  IS SIGNIFICANTLY SMALLER THAN  $m$



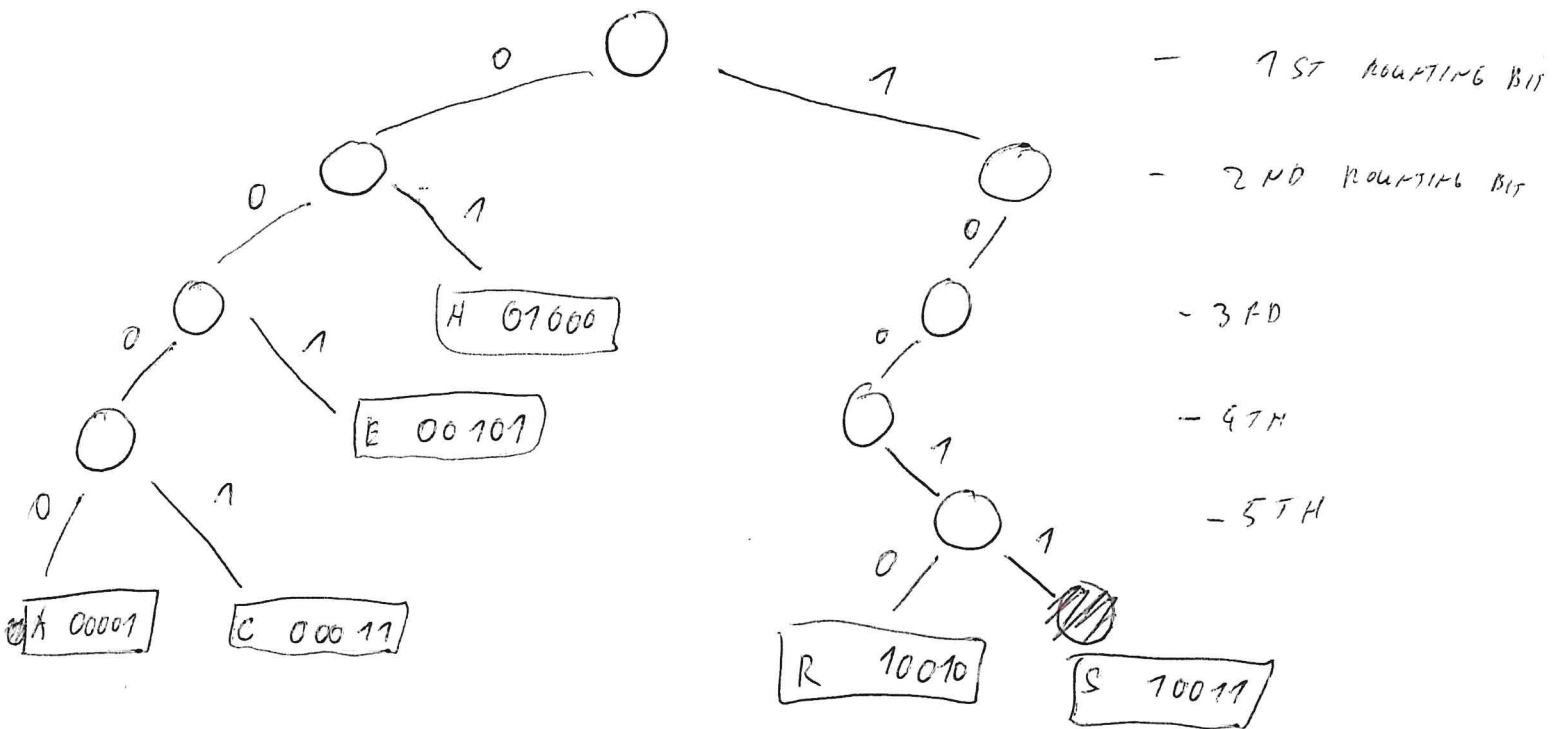
# - BINARY TRIE

- KEYS ARE SEQUENCES OF BITS

- KEYS IN ROOTS ONLY, INNER NODES ARE ROUTERS ONLY

- KEY MUST NOT BE PREFIX OF ANOTHER KEY

- THIS CAN BE MADE TRUE BY REPRESENTATION HAVING THE SAME LENGTH



- INSERT CAN MAKE SEVERAL NEW NODES

- INSERT I 01001

