# **B** Trees

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### **OUTLINE**

- •Introduction
- Definition
- Basic Operations
- Applications

### Introduction

- Motivation
- Overview
- Original Publication
- o B-tree ...

### INTRODUCTION--MOTIVATION

- When data is too large to fit in main memory, then the number of disk accesses becomes important.
- Disk access is unbelievably expensive compared to a typical computer instruction (mechanical limitations).
- One disk access is worth about 200,000 instructions.
- The number of disk accesses will dominate the running time.

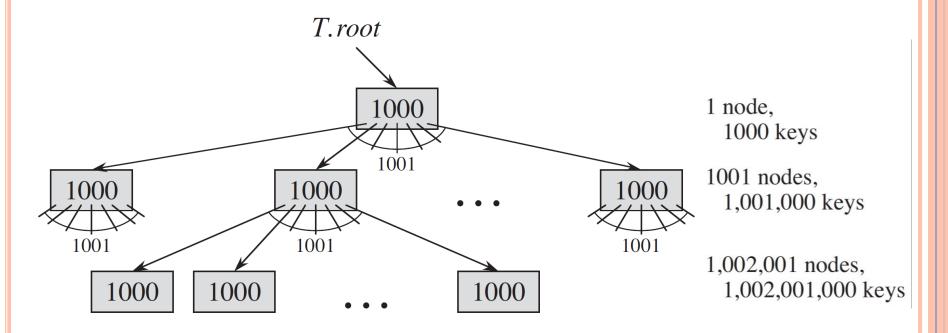
### INTRODUCTION--MOTIVATION

- Secondary memory (disk) is divided into equal-sized blocks (typical sizes are 512, 2048, 4096 or 8192 bytes).
- Basic I/O operation transfers the contents of one disk block to/from main memory.
- Goal is to devise a <u>multiway search tree</u> that will minimize file accesses (by exploiting disk block read).

#### **O**VERVIEW

- Have many children, from a handful to thousands.
- The "branching factor" of a B-tree can be quite large, although it is usually determined by characteristics of the disk unit used.
- o B-trees are *similar* to red-black trees in that every n-node B-tree has height  $O(\lg n)$ .
- Although the height of a B-tree can be <u>considerably</u> <u>less than</u> that of a red-black tree because its branching factor can be much larger.

### **EXAMPLE**



A B-tree of height 2 containing over one billion keys.

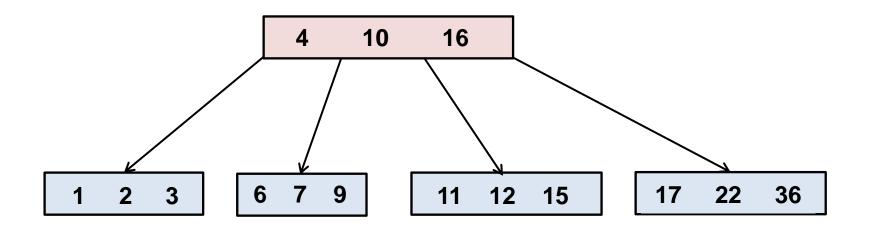
#### **EXAMPLE**

- For a large B-tree stored on a disk, branching factors between 50 and 2000 are *often* used, depending on the size of a key <u>relative to</u> the size of a page.
- A large branching factor *dramatically reduces* both the *height* of the tree and the *number* of disk accesses required to **find any key**.
- This B-tree with a *branching factor of 1001* and height 2 that can store over one **billion** keys.
- Nevertheless, since the *root* node can be kept permanently in main memory, *only two disk accesses* at most are required to find any key in this tree!

### **OVERVIEW--STRUCTURES**

- If an **internal** B-tree node x contains n[x] keys, then x has n[x]+1 children.
- The keys in node x are used as dividing points separating the range of keys handled by x into n[x]+1 subranges, each handled by one child of x.
- When searching for a key in a B-tree, we make an (n[x]+1)-way decision based on comparisons with the n[x] keys stored at node x.
- The *structure of leaf nodes* differs from that of internal nodes; we will examine these differences later.

## **EXAMPLE**



### OVERVIEW--HOW TO WORK

- In a typical B-tree application, the amount of data handled is so large that all the data do not fit into main memory at once.
- The B-tree algorithms <u>copy</u> selected pages from disk into main memory as **needed** and <u>write back</u> onto disk the pages that have **changed**.
- B-tree algorithms are designed so that only <u>a constant</u> <u>number of pages</u> are in main memory at any time.
- Thus, the size of main memory does not limit the size of B-trees that can be handled.

### **OVERVIEW--THE ORIGINAL PUBLICATION**

- o Rudolf Bayer, Edward M. McCreight
- Organization and Maintenance of Large Ordered Indices
- 1972

### OVERVIEW--B-TREE...

- Also known as balanced multiway tree
- Generalization (I am a kind of ...) balanced tree, search tree.
- Specialization (... is a kind of me.)

```
2-3-4 tree, B^*-tree, 2-3 tree . . .
```

### OVERVIEW--B-TREE...

- The B-tree's creators, Rudolf Bayer and Ed McCreight, have not explained what, if anything, the **B** stands for.
- The most common belief is that **B** stands for balanced, as all the leaf nodes are at the same level in the tree.
- B may also stand for *Bayer*, or for *Boeing*, because they were working for Boeing Scientific Research Labs at the time.

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- 1. Every node x has the following fields
  - n[x], the number of keys currently stored in node x.
  - The n[x] keys themselves stored in **nondecreasing** order, so that  $\text{key}_1[x] \leq \text{key}_2[x] \leq ... \leq \text{key}_{n[x]}[x]$ .
  - Leaf[x], a boolean value that is <u>TRUE</u> if x is a leaf and FALSE if x is an internal node.

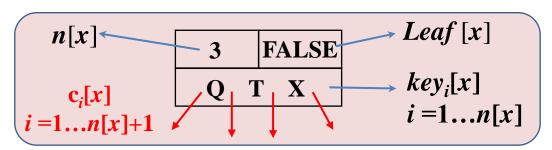
$$n[x] \xrightarrow{3} FALSE \xrightarrow{} Leaf[x]$$

$$Q T X \xrightarrow{} key_i[x]$$

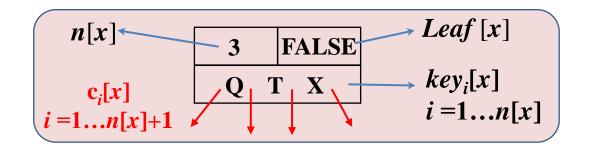
$$i = 1...n[x]$$

- **2.** Each internal node x also contains n[x]+1 pointers  $c_1[x]$ ,  $c_2[x]$ , ...,  $c_{n[x]+1}[x]$  to its children. Leaf nodes have no children, so their  $c_i$  fields are undefined.
- **o 3.** The keys  $key_i[x]$  separate the ranges of keys stored in each subtree: if  $k_i$  is <u>any key</u> stored in the <u>subtree</u> with the <u>root</u>  $c_i[x]$ , then

$$k_1 \le \text{key}_1[x] \le k_2 \le \text{key}_2[x] \le \dots \le \text{key}_{n[x]}[x] \le k_{n[x]+1}$$

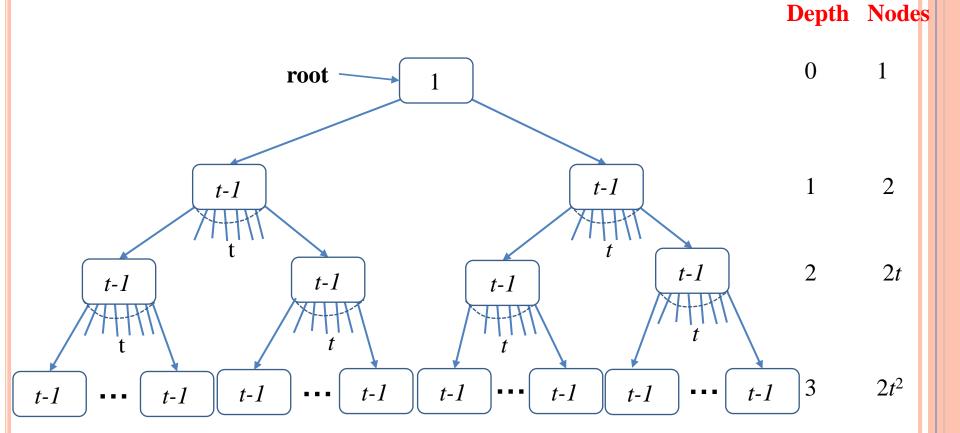


- 4. All leaves have the same depth, which is the tree's height h.
- 5. There are <u>lower</u> and <u>upper</u> bounds on the number of keys that a node can contain. These bounds can be expressed in terms of a fixed integer  $t \ge 2$  called *a minimum degree* of the B-tree:



- 5. There are <u>lower</u> and <u>upper</u> bounds on the number of keys that a node can contain. These bounds: a minimum degree of the B-tree:
  - Every node <u>other than the root</u> must have at least *t*-1 keys. Every internal node <u>other than the root</u> thus has at least *t children*. If the tree is **nonempty**, the root must have <u>at least</u> one key.
  - Every node can contain <u>at most 2t-1</u> keys, therefore, an internal node can have <u>at most 2t children</u>. we say that a node is *full* if it contains exactly 2t-1 keys.

### DEFINITION--B-TREE HEIGHT



### DEFINITION--B-TREE HEIGHT

- $h \le \log_t((n+1)/2)$  (t\ge 2, page 489-490)
- The worst case height is  $O(\log n)$ . Since the "branchiness" of a B-tree can be large compared to many other <u>balanced</u> tree structures, *the base of the logarithm* tends to be large.
- Therefore, the number of nodes visited **during a search** tends to be smaller than the one required by other tree structures.
- Although this does not affect the *asymptotic* worst case height, B-trees tend to have <u>smaller heights</u> than other trees with the same *asymptotic* height.

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### TWO CONVENTIONS

- The root of the B-tree is always in main memory, so that we never need to perform a DISK-READ on the root; we do have to perform a DISK-WRITE of the root, however, whenever the root node is changed.
- Any nodes that are passed as parameters must already have had a DISK-READ operation performed on them.

### **BASIC OPERATIONS**

- Searching a B-tree
- Create an empty B-tree
- Splitting a node
- Inserting a key
- Deleting a key

### BASIC OPERATIONS--SEARCH

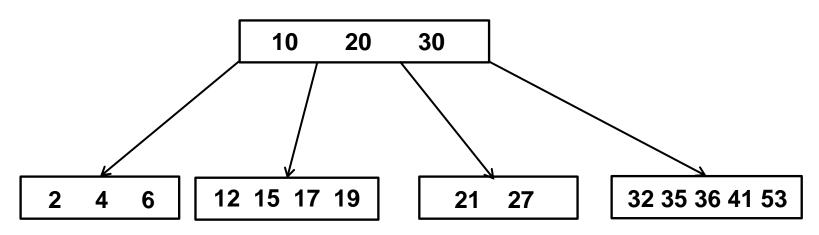
- The search operation on a B-tree is *analogous to a* search on a binary tree.
- Instead of choosing between a left and a right child as in a binary tree, a B-tree search must make an (n[x]+1)-way choice.
- The correct child is chosen by performing *a linear* search of the values in the node.

### BASIC OPERATIONS--SEARCH

```
B-TREE-SEARCH (x, k)
1 i \leftarrow 1
2 while i \le n[x] and k > \text{key}_i[x]
     do i \leftarrow i + 1
4 if i \le n[x] and k == \ker_i[x]
     then return (x, i)
6 elseif leaf[x]
     then return NIL
  else Disk-Read(c_i[x])
9
          return B-Tree-Search(c_i[x], k)
```

## BASIC OPERATIONS--SEARCH

B-Tree; Minimum Degree t = 3; Minimum keys = 2; Maximum keys = 5



Search(21)

### BASIC OPERATIONS—SEARCH ANALYSIS

- After finding the value greater than or equal to the desired value, the child pointer to the immediate *left* of that value is followed. If all values are <u>less than</u> the desired value, the *rightmost* child pointer is followed.
- Of course, the search can be <u>terminated</u> as soon as the desired node is found.
- $\circ$   $O(\log_t n)$  disk operation
- $\circ$   $O(t \log_t n)$  CPU time

### BASIC OPERATIONS

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### BASIC OPERATIONS--CREATE

- The *B-Tree-Create* operation creates an empty B-tree by allocating a new root node that has *no* keys and is a *leaf* node.
- Only the *root* node is permitted to have these properties; all other nodes must meet the criteria outlined previously.
- O(1) disk operation
- *O*(1) CPU time

#### **B-Tree-Create(T)**

- $1 x \leftarrow \text{Allocate-Node}()$
- $2 \operatorname{leaf}[x] \leftarrow \operatorname{TRUE}$
- $3 n[x] \leftarrow 0$
- 4 Disk-Write(x)
- $5 \operatorname{root}[T] \leftarrow x$

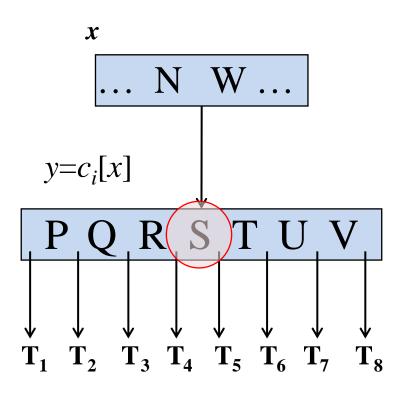
### BASIC OPERATIONS

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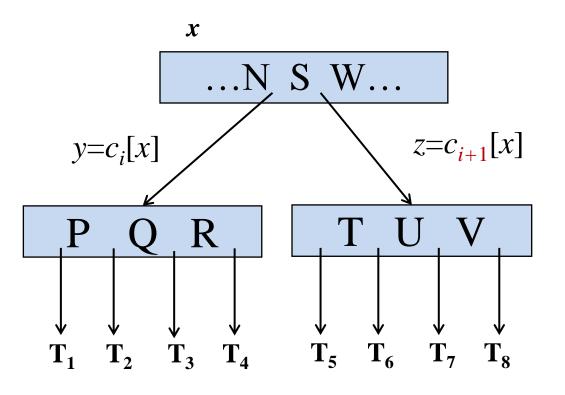
### BASIC OPERATIONS--WHY NEED SPLIT

- When inserting a key into a B-tree, we **can't** simply create a new leaf node and insert it, as the result tree would fail to be **a valid B-tree**.
- If is node becomes "too *full*" (having 2*t*-1 keys), it is necessary to perform a split operation.
- o It splits a full node y (having 2t-1 keys) around its median key  $key_t[y]$  into two nodes having t-1 keys each.
- The median key *moves up* into y's **parent** to identify the dividing point between the two new trees.

## BASIC OPERATIONS--SPLITTING



## BASIC OPERATIONS--SPLITTING



### BASIC OPERATIONS--SPLITTING

```
B-Tree-Split-Child(x, i, y)
1 z \leftarrow Allocate-Node()
2 leaf[z] \leftarrow leaf[y]
3 n[z] \leftarrow t-1
4 for j←1 to t-1
        do \ker_{i}[z] \leftarrow \ker_{i+t}[y]
6 if not leaf[y]
        then for j \leftarrow 1 to t
                 \mathbf{do} \ \mathbf{c}_{i}[\mathbf{z}] \leftarrow \mathbf{c}_{i+t}[\mathbf{y}]
   n[y] \leftarrow t - 1
```

```
10 for j \leftarrow n[x] + 1 downto i+1
        \mathbf{do} \ \mathbf{c}_{i+1}[x] \leftarrow \mathbf{c}_i[x]
12 \ c_{i+1}[x] \leftarrow z
13 for j \leftarrow n[x] downto i
14 do \ker_{i+1}[x] \leftarrow \ker_i[x]
15 \ker_i[x] \leftarrow \ker_i[y]
16 \ n[x] \leftarrow n[x] + 1
17 Disk-Write(y)
18 Disk-Write(z)
19 Disk-Write(x)
```

### BASIC OPERATIONS--SPLITTING ANALYSIS

- The split operation moves the <u>median key</u> of node y into its <u>parent</u> x where y is the i-th child of x.
- A new node, **z**, is allocated, and all keys in *y* <u>right</u> of the median key are moved to **z**. The keys <u>left</u> of the median key remain in the original node **y**.
- The new node,  $\mathbf{z}$ , becomes the child immediately to the right of the median key that was moved to the parent x, and the original node, y, becomes the child immediately to the left of the median key that was moved into the parent x.

#### BASIC OPERATIONS--SPLITTING ANALYSIS

- o The split operation transforms a full node with 2t 1 keys into two nodes with t − 1 keys each. Note that one key is moved into the <u>parent</u> node.
- $\circ$  O(1) disk operations
- $\circ$   $\Theta(t)$  CPU times

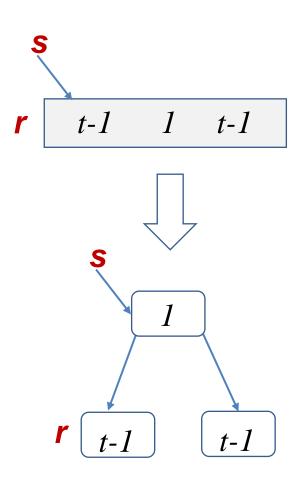
#### **BASIC OPERATIONS**

- Searching a B-tree
- Create an empty B-tree
- Splitting a node
- Inserting a key
- Deleting a key

- To perform an insertion on a B-tree, the appropriate node for the key must be located using an algorithm similar to *B-Tree-Search*.
- Next, the key must be inserted into the node.
  - If the node is **not full** prior to the insertion, no special action is required;
  - However, if the node is **full**, the node must be split to make room for the new key.
- Since **splitting** the node results in moving one key to the parent node, **the parent node** must <u>not be full or another split operation</u> is required.
- This process may repeat all the way <u>up to the root</u> and may require splitting the root node.

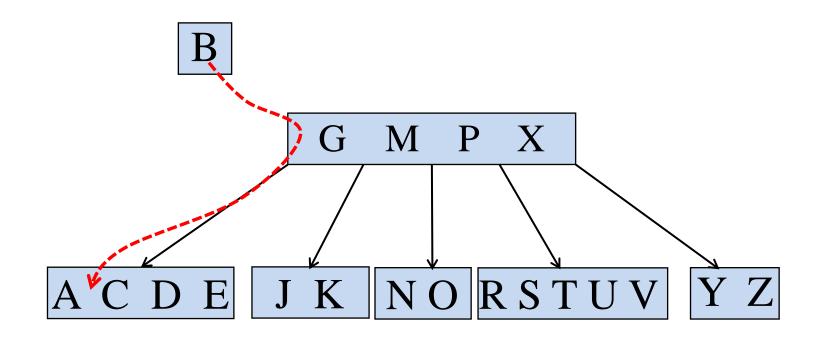
- This approach requires two passes:
  - The first pass locates the node where the key should be inserted (**Search**);
  - The second pass performs any required splits on the ancestor nodes (**Split**).
- We **don't wait** to find out <u>whether</u> we will need to split a full node. Instead, as we travel down the tree searching for the new key belongs, we split each <u>full node</u> we come to along the way.
- Thus, whenever we want to split a full node y, we are assumed that its <u>parents</u> is <u>not full</u>.

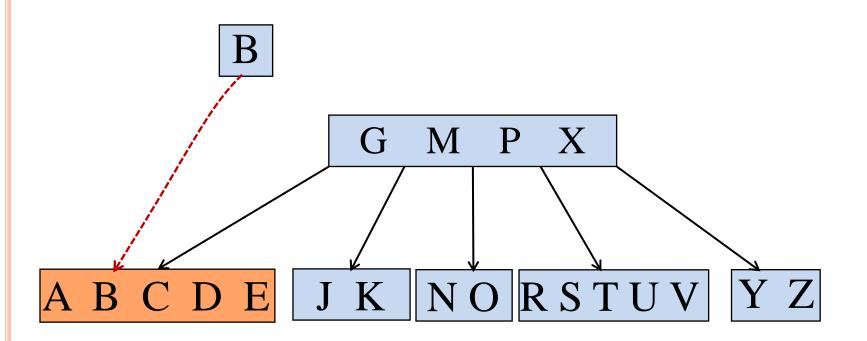
```
B-Tree-Insert(T, k)
1 r \leftarrow \text{root}[T]
  if n[r] = 2t - 1 then
3
4
5
6
7
8
        s \leftarrow \text{Allocate-Node}()
       root[T] \leftarrow s
       leaf[s] \leftarrow FALSE
     n[s] \leftarrow 0
        c_1 \leftarrow r
        B-Tree-Split-Child(s, 1, r)
        B-Tree-Insert-Nonfull(s, k)
10 else
       B-Tree-Insert-Nonfull(r, k)
```

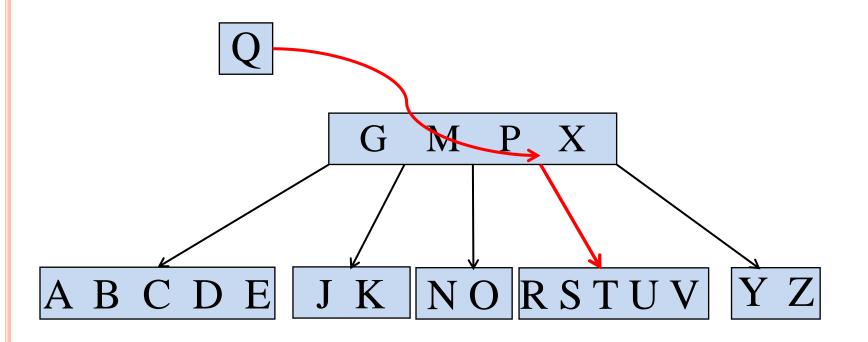


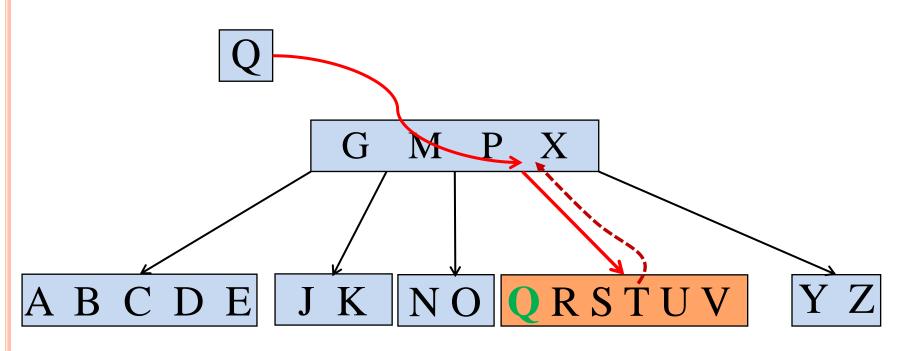
```
B-Tree-Insert-Nonfull(x, k)
1 i \leftarrow n[x]
  if leaf[x]
     then while i \ge 1 and k < \text{key}_i[x]
                 do \ker_{i+1}[x] \leftarrow \ker_i[x]
                       i \leftarrow i - 1
      \ker_{i+1}[x] \leftarrow k
      n[x] \leftarrow n[x] + 1
      Disk-Write(x)
```

```
9 else while i \ge 1 and k < \text{key}_i[x]
10
               do i \leftarrow i - 1
        i \leftarrow i + 1
12
        Disk-Read(c_i[x])
13
        if n[c_i[x]] == 2t - 1
14
         then
            B-Tree-Split-Child(x, i, c_i[x])
            if k > \text{key}_i[x]
15
               then i \leftarrow i + 1
16
17
        B-Tree-Insert-Nonfull(c_i[x], k)
```

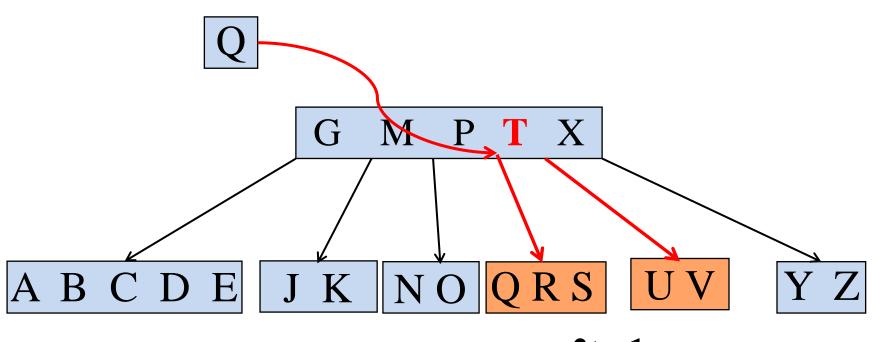




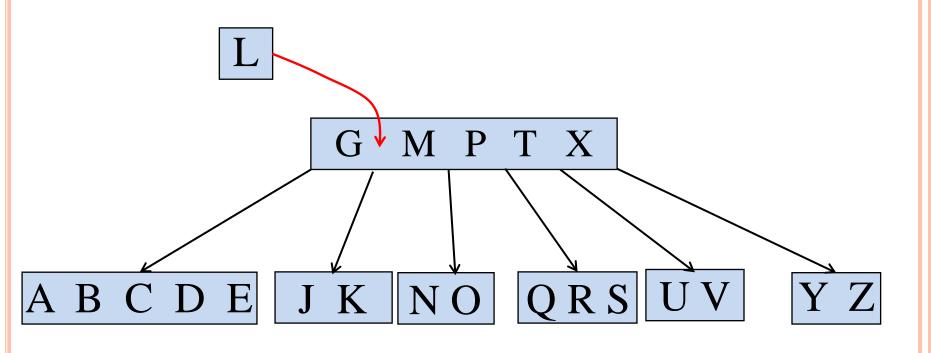




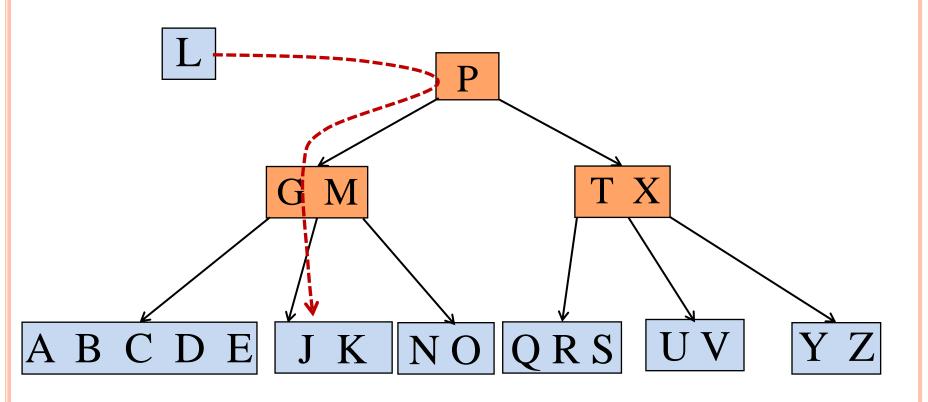
2t - 1Minimum Degree t = 3



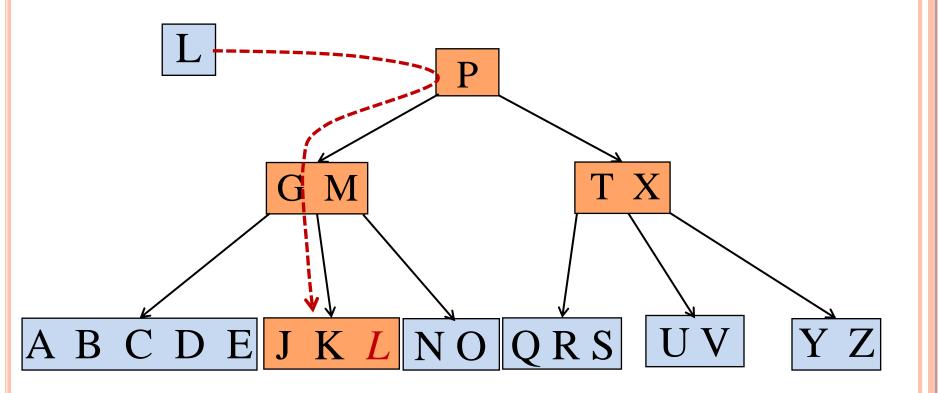
2t - 1Minimum Degree t = 3

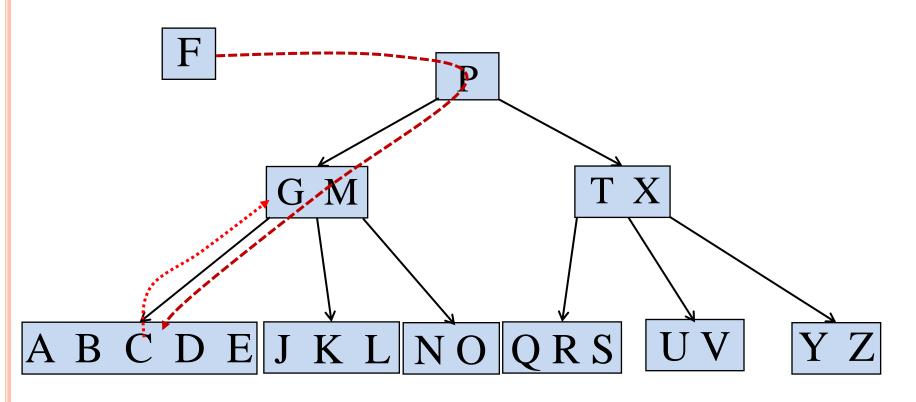


2t - 1Minimum Degree t = 3

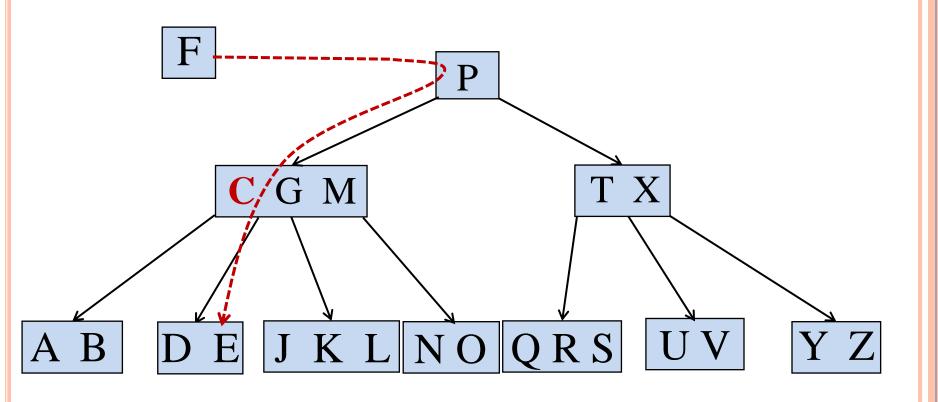


2t - 1Minimum Degree t = 3

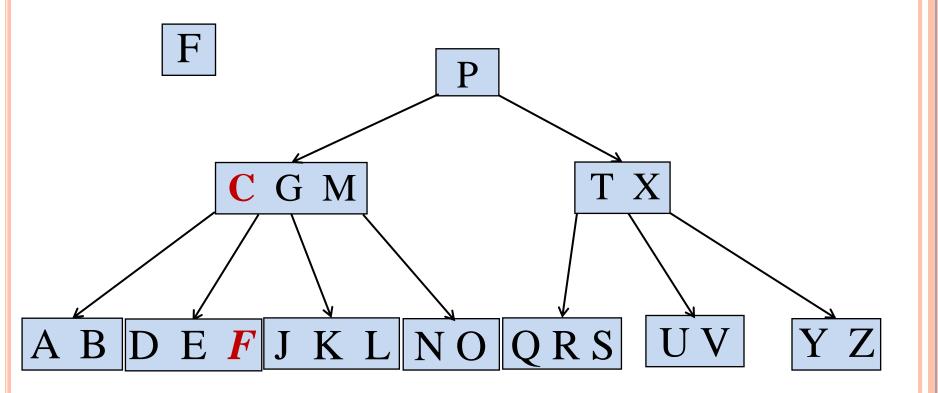




2t - 1Minimum Degree t = 3

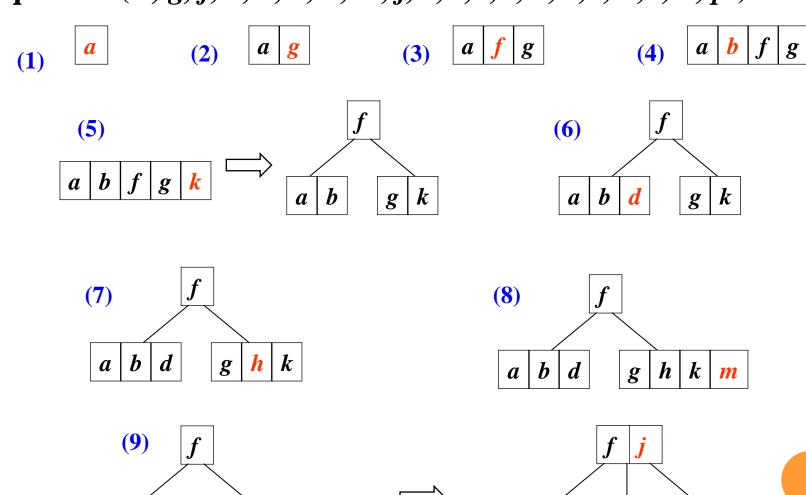


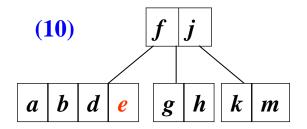
2t - 1Minimum Degree t = 3

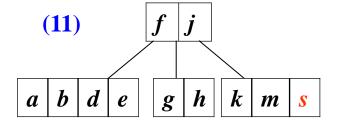


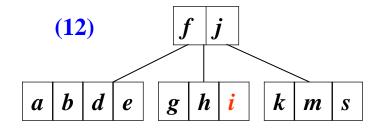
g

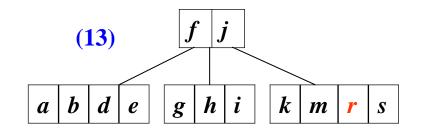
Sequence: (a, g, f, b, k, d, h, m, j, e, s, i, r, x, c, l, n, t, u, p) t = 5

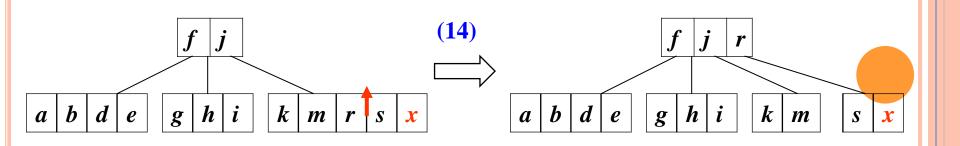


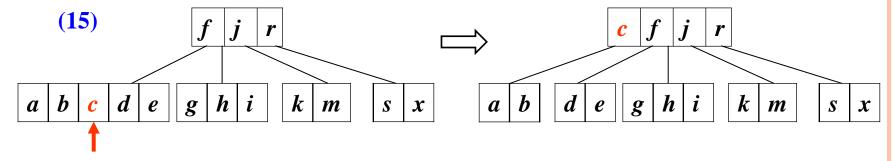


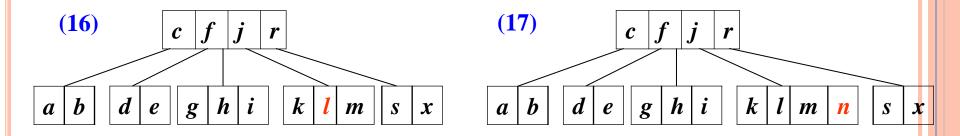


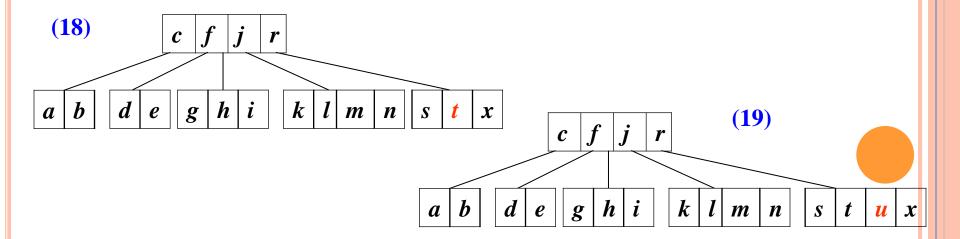


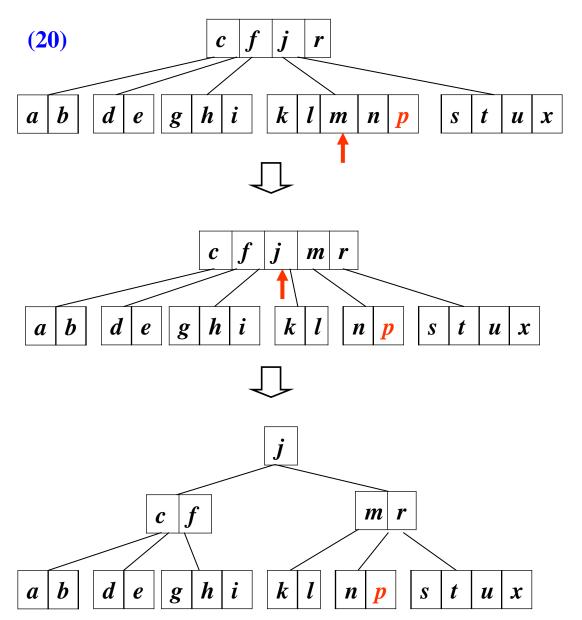












# BASIC OPERATIONS--Insertion Analysis

- Since each access to a node may correspond to a costly disk access, it is desirable to avoid the second pass by ensuring that the parent node is never *full*.
- To accomplish this, the presented algorithm <u>splits any full</u> <u>nodes encountered while descending the tree</u>.
- Although this approach may result in unnecessary split operations, it guarantees that the parent never needs to be split and eliminates the need for a second pass up the tree.
- Since a split runs in linear time, it has little effect on the  $O(t \log_t n)$  running time of *B-Tree-Insert*.

### **BASIC OPERATIONS**

- Searching a B-tree
- Create an empty B-tree
- Splitting a node
- Inserting a key
- Deleting a key

- There are *two popular strategies* for deletion from a B-Tree.
  - Locate and <u>delete the item, then restructure</u> the tree to regain its invariants.
  - Do a single pass down the tree, but <u>before</u> <u>entering (visiting) a node, restructure the tree</u> so that once the key to be deleted is encountered, it can be deleted without triggering the need for any further restructuring.

- o 1. If the key k is in node x and x is a leaf, delete the key k from x.
- 2. If the key k is in node x and x is an internal node, do the following:
  - a. If the child y that precedes k in node x has at least t keys, then find the predecessor k' of k in the subtree rooted at y. Recursively delete k', and replace k by k' in x. (Finding k' and deleting it can be performed in a single downward pass.)

- 2. If the key k is in node x and x is an internal node, do the following:
  - b. (y has fewer than t keys) Symmetrically, if the child z that follows k in node x has at least t keys, then find the successor k' of k in the subtree rooted at z. Recursively delete k, and replace k by k' in x. (Finding k' and deleting it can be performed in a single downward pass.)
  - c. Otherwise, if both y and z have only t 1 keys, merge k and all of z into y, so that x loses both k and the pointer to z, and y now contains 2t 1 keys. Then, free z and recursively delete k from y.

- 3. If the key k is not present in internal node x, determine the root  $c_i[x]$  of the appropriate subtree that must contain k, if k is in the tree at all. If  $c_i[x]$  has only t 1 keys, execute step 3a or 3b as necessary to guarantee that we descend to a node containing at least t keys. Then, finish by recursing on the appropriate child of x.
  - a. If  $c_i[x]$  has only t 1 keys but has an immediate sibling with at least t keys, give  $c_i[x]$  an extra key by moving a key from x down into  $c_i[x]$ , moving a key from  $c_i[x]$ 's immediate left or right sibling up into x, and moving the appropriate child pointer from the sibling into  $c_i[x]$ .

- 3. If the key k is not present in internal node x, determine the root  $c_i[x]$  of the appropriate subtree that must contain k, if k is in the tree at all. If  $c_i[x]$  has only t 1 keys, execute step a or a as necessary to guarantee that we descend to a node containing at least a keys. Then, finish by recursing on the appropriate child of a.
  - **b.** If  $c_i[x]$  and both of  $c_i[x]$ 's immediate siblings have t-1 keys, merge  $c_i[x]$  with one sibling, which involves moving a key from x down into the new merged node to become the median key for that node.

#### BASIC OPERATIONS--VARIETIES

- 2-3-4 tree is a B-tree of order 4
- **2-3 tree** is a B-tree that can contain only 2-nodes (a node with 1 field and 2 children) and 3-nodes (a node with 2 fields and 3 children)
- **B**+ **tree** (also known as a Quarternary Tree) is a variety of B-tree, in contrast to a B-tree, all records are stored at the lowest level of the tree; only keys are stored in interior blocks.
- **B\*-tree** is a tree data structure, a variety of B-tree used in the HFS and Reiser4 file systems, which requires non-root nodes to be at least 2/3 full instead of 1/2.

### **OUTLINE**

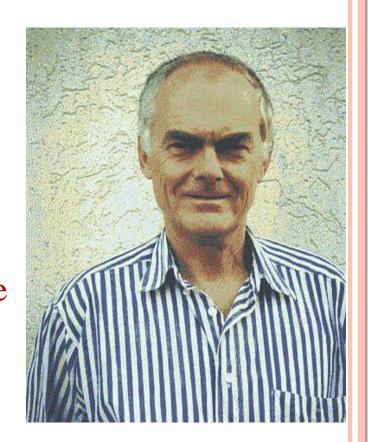
- Introduction
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#### **APPLICATIONS**

- As databases cannot typically be maintained entirely in memory, B-trees are often used to <u>index the data</u> and to <u>provide fast access</u>.
  - For example, searching an unindexed and unsorted database containing n key values will have a worst case running time of O(n).
- Search Engine Index
- · · · ·

#### RUDOLF BAYER

- He is a professor emeritus of Informatics at the Technical University of Munich where he has been employed since 1972.
- He is noted for inventing three data sorting structures: the B-tree (with Edward M. McCreight), the UB-tree (with Volker Markl) and the Redblack tree.
- A recipient of 2001 ACM SIGMOD Edgar F. Codd Innovations Award



### EDWARD M. MCCREIGHT

- Co-invented the B-tree, and improved Weiner's algorithm to compute the suffix tree of a string.
- Co-designed the *Xerox Alto workstation*.
- Co-led the design and construction of the Xerox Dorado computer at Xerox Palo Alto Research Center.
- Worked at Adobe Systems.
- Guest professor at the University of Washington, Stanford University, the Technical University of Munich, and the Swiss Federal Institute of Technology in Zürich.

