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Prepared by: [Arun Konagurthu]

FIT3155 S1/2020: Algorithms and Data Structures Week 7: **B-Trees: A generalized balanced Search Tree**

Faculty of Information Technology, Monash University

What is covered in this lecture?

- A generalization of the balanced search trees
- Standard operations on B-trees (search, insert, delete)
- Space and time **complexity** issues

Source material and recommended reading

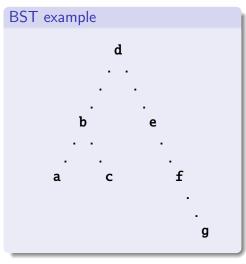
Cormen et al. "Introduction to Algorithms" (Chapter 18) [link]

Original papers

- R. Bayer and E. McCreight
 - Organization and Maintenance of Large Ordered Indices,
 Mathematical and Information Sciences Report No. 20, Boeing Scientific Research Laboratories. 1970
- R. Bayer,
 - Binary B-Trees for Virtual Memory, Proceedings of 1971
 ACM-SIGFIDET Workshop on Data Description, Access and Control, San Diego, California. November 1112, 1971.

Revision from FIT2004: Balanced Binary Search Trees

- The empty tree is a balanced BST
- If the tree is not empty,
 - the elements in the left subtree are ≤ the element in the root
 - 2 the elements in the right subtree are > the element in the root
 - the left subtree is a balanced BST
 - the right subtree is a balanced BST



Detour: Data structures on secondary storage

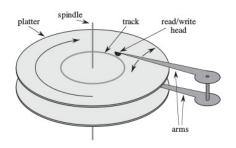
- Computers, as you know, has different kinds of storage/memory. primary storage:
 - ▶ The **main memory** consists of silicon chip.
 - Orders of magnitude more expensive per bit stored (compared to magnetic storages).

secondary storage:

- Mostly, based on magnetic storage technology. (Solid state technology is surging.)
- Orders of magnitude more space (compared to primary) storages).

Detour: A typical disk drive

- A typical secondary (external) drive consists of:
 - one or more platters covered with magnetizable material that rotate around a spindle.
 - Read and write to each platter is via a head attached to an arm.
 - The arms can move their heads towards or away from the spindle.
 - When the arm is stationary, the surface below the head is called a track.



Detour: Read/Write Access times

- Secondary storage is much slower because they have moving parts
 - Platter rotations (5,400-15,000 RPM).
 - Arm head forward/backward movement.
- At 7,200 RPM, one rotation takes 8.33 milliseconds, which is...
- ullet ... 5 orders of magnitude > than 50 nanoseconds access time to main memory.
- That is, in time to wait for one read/write on a secondary storage, we can access primary memory 100,000 times during that span.
- Average access times for commodity disks are in the range 8 to 11 milliseconds.

Detour: Disk access a page worth of information at a time

- To amortize the time wasted during mechanical movements, each disk access reads
 - not just one item but several items at a time.
- Information is divided (logically) into equal-sized pages of bits.
- Each access reads/writes one or more pages worth of information at a time.
- A page contains from 4KB to 64KB (in some cases) worth of information.
- The number of disk accesses is measured in terms of the number of pages of information.

Disk based search tree structures

- Consider the cases when we have large (dynamic) database/dictionary, too big to fit in main memory.
- Accessing its information, we have the following cost model to optimize:
 - Minimize expected number of disk accesses during various operations (insert/delete/search).
 - Keep space requirement to O(n).
- Binary trees such as AVL trees are not optimal for disk-based representations.
- Generalization to multi-way search trees greatly reduce the accesses.
- B-tree (or its variants) is a very practical, widely-used data structure for this purpose.

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- By generalization, the tree is no longer binary but has many branches per node.

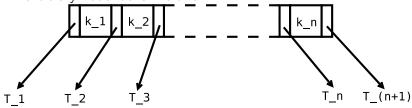
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- They are really powerful and are used on many mission critical systems that rely on a large amount of data stored on a **secondary storage** device (disk)
- Common examples are very large databases and filesystems

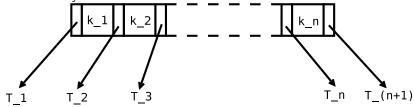
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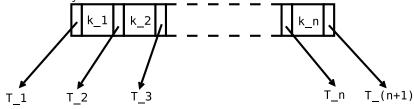


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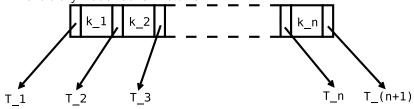
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- **3** It has n elements: $k_1 \le k_2 \le \cdots \le k_n$ that are stored in a **non-decreasing** (sorted) order.
- **1** It also stores n+1 pointers/links to subtrees: $T_1, T_2, \cdots, T_n, T_{n+1}$ that are **distributed regularly** between the elements.

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- **3** Each successive (k_i, T_i, T_{i+1}) resembles a **fork**/node of a **binary** tree and has the BST **structural property**: $\{T_i\} \leq k_i \leq \{T_{i+1}\}$. Or, generalizing

$$\{T_1\} \le k_1 \le \{T_2\} \le k_2 \le \{T_3\} \le \dots \le \{T_n\} \le k_n \le \{T_{n+1}\}$$

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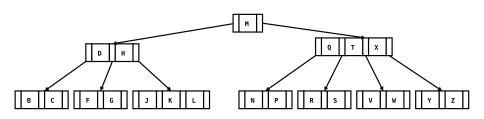
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The simplest B-tree is when t=2. Every internal node has either 2, 3, or 4 subtrees connecting its 1, 2 or 3 elements. This is specifically called a [2-3-4] tree.

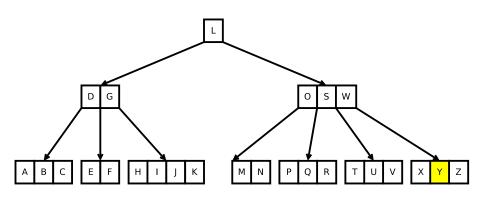
Example of a B-tree containing consonants of the English Alphabet



Searching for element **x** in a B-tree

- Searching in B-tree is no different from searching in any binary search tree..
- However, since each node has $t \geq 2$ children, the decision is no longer two-way or binary.
- A multi-way branching decision has to be made according to its number of children/subtrees.

Search for ' \mathbf{Y} ' in a B-tree made from all letters from the English alphabet.



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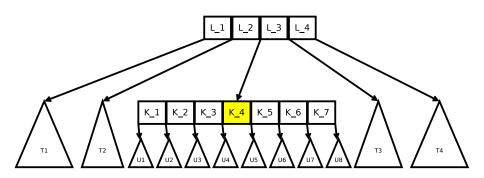
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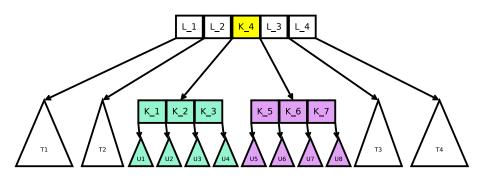
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 - * This implies, when traversing from root to leaf in a B-tree, **split** any **full parent node** of a (sub)tree along the insertion path.

Splitting illustration (general case)

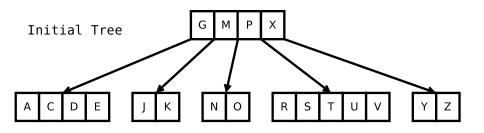


Splitting illustration (general case)



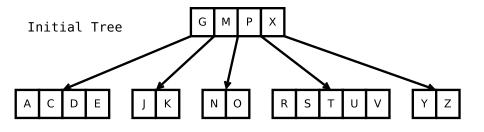
Note:

Lower bound on the number of **elements**: t-1=2 (except root node) **Upper bound** on the number of **elements**: 2t-1=5



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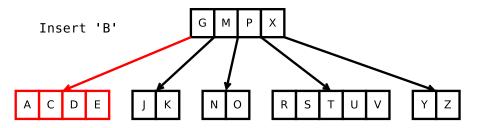
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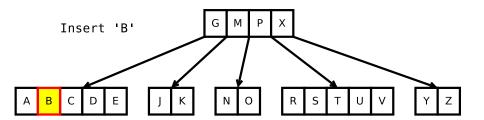


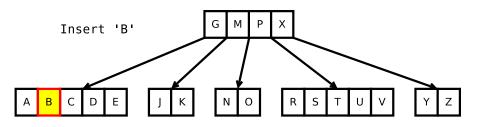
Next

insert('B') into this tree.

To insert element B, traverse along an 'appropriate' subtree

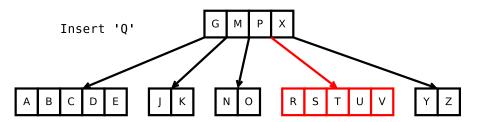


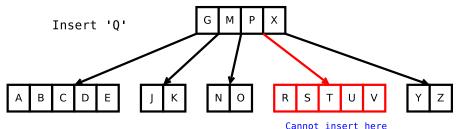




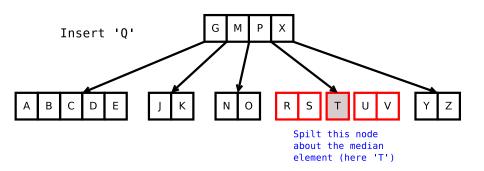
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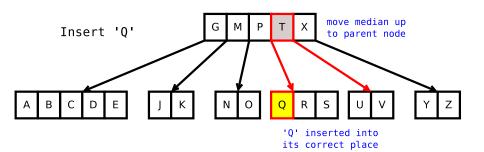
insert('Q') into this tree.

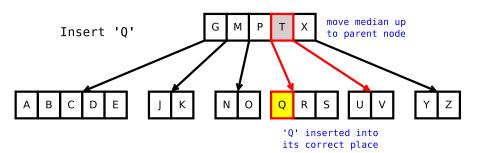




Cannot insert here as node has max number of elements in it

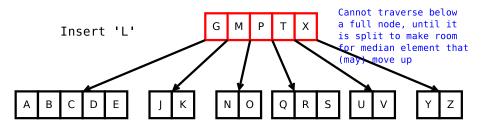


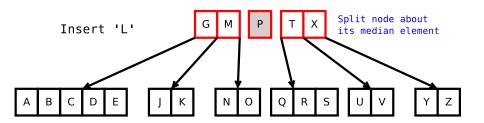


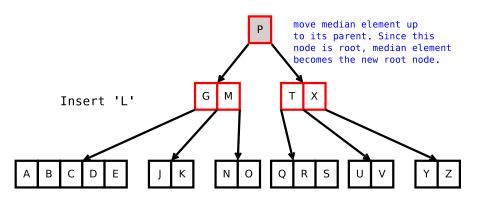


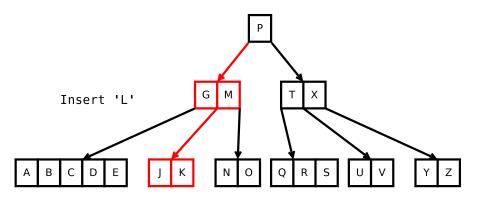
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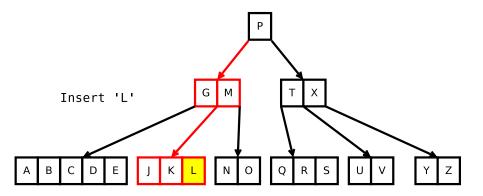
insert('L') into this tree.

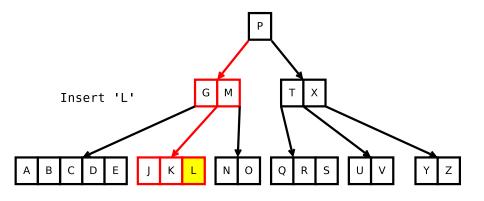






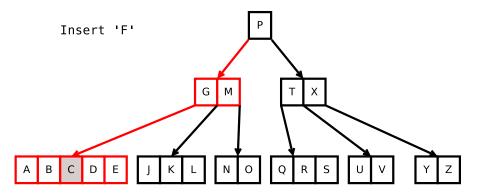


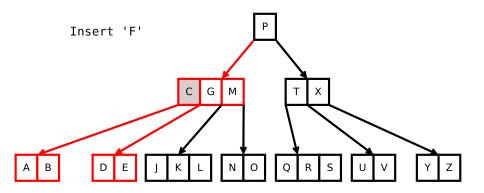


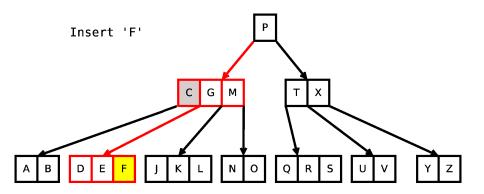


Next

insert('F') into this tree.







Deleting x from a B-tree - Case 1

• Case 1: If **x** belongs to a leaf node with $\geq t$ elements. Delete **x** – trivial!

Deleting **x** from a B-tree – Case 2

- Case 2:If x belongs to an internal node:
 - If the left child node of x has at least t elements, then find the in-order predecessor (say, w) in the left subtree, replace x with w, and then recursively delete w in the left subtree.
 - \bigcirc Else if the right child node of **x** has at least t elements, then find the in-order successor (say, y) in the right subtree, replace x with y, and then recursively delete y in the right subtree.
 - Else, both **left** and **right** child nodes of **x** have **exactly** t-1elements, then merge x and child nodes, and recursively delete x.

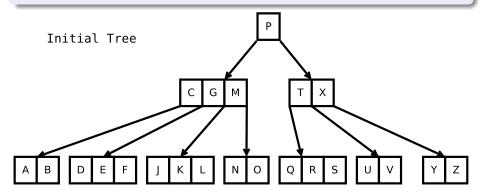
Deleting **x** from a B-tree – Case 3

- Case 3: If the traversal is stopped because the 'appropriate' subtree containing **x** has a node with **exactly** t-1 elements, then :
 - if this subtree's 'immediate sibling' has at least t elements, give an extra element to the appropriate subtree by **rotating** the predecessor or successor element within the sibling node to parent, followed by moving the original parent element to the appropriate subtree.
 - lacktriangle else, if its **immediate sibling** also has **exactly** t-1 elements, merge the parent element with both sibling elements to form a single node. This may reduce the height of the tree.

Deleting from a B-Tree (degree t = 3): Running examples

Note:

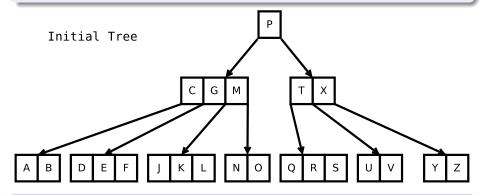
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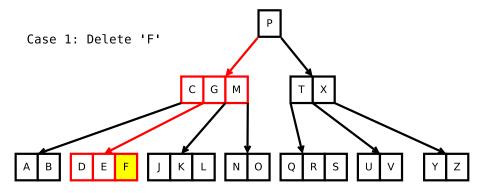
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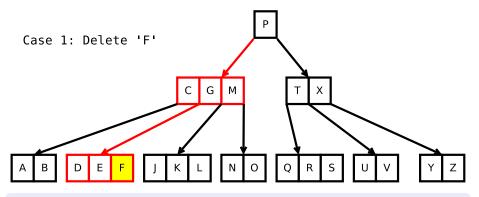
Next

delete('F') from this tree.

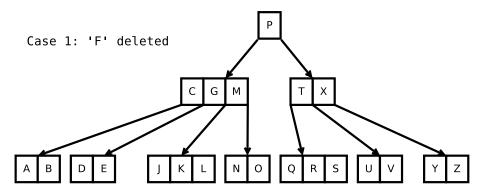
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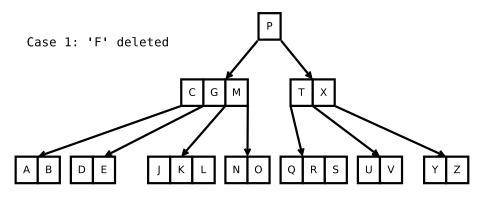


1 \mathbf{x} ='F' belongs to a **leaf node** with $\geq t (=3)$ elements.



Since 'F' is a leaf node with $\geq t (=3)$ elements, deleting 'F' involves just removing that element – **trivial**!

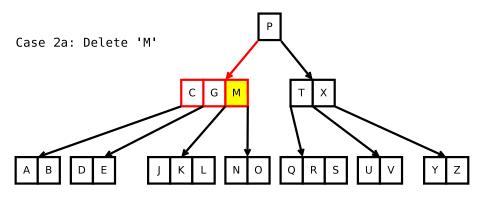




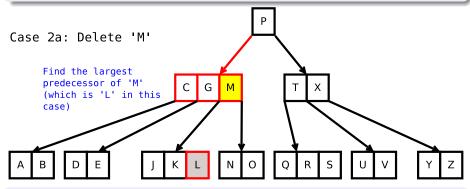
Next

delete('M') from this tree.

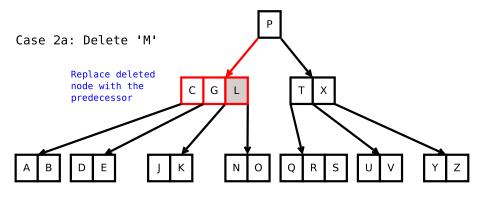
- $\mathbf{2} \mathbf{x} = \mathbf{M'}$ belongs to an **internal node**:
 - If the left child node of x has at least t elements, then find the in-order predecessor (say, w = 'L' in this example) in the left subtree, replace x with w, and then recursively delete w in the left subtree.



In-order predecessor of any element **x** in the B-tree is the largest element that is $\langle x$. This can be derived by traversing the left subtree of x and accessing the **rightmost** element in that subtree.



In this example, the **in-order predecessor** of 'M' is 'L'. To delete 'M', replace 'M' with its **predecessor** 'L', and (recursively) delete 'L' in the left subtree (next slide)



Case 2b mirrors Case 2a

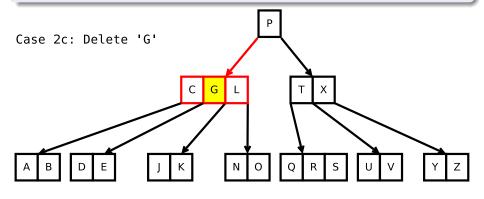
- 2 If x belongs to an internal node:
 - ... if the right child node of x has at least t elements, then find the in-order successor (say, y) in the right subtree, replace x with y, and then recursively delete y in the right subtree.

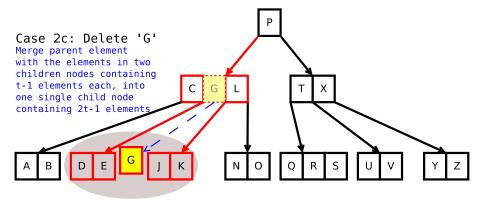
In-order successor of any element **x** in the B-tree is the smallest element that is > **x**. This can be derived by traversing the right subtree of **x** and accessing the **leftmost** element in that subtree.

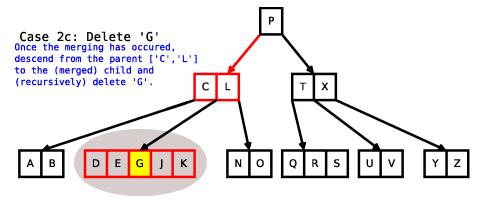
No explicit example needed to demonstrate Case 2b, as it is symmetric (or mirror operation) to Case 2a, whose example we have seen above.

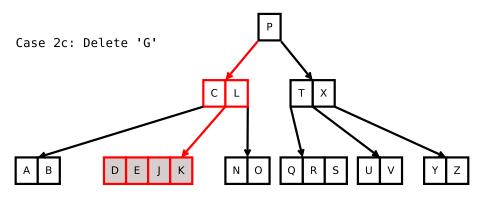
Delete 'G' – Case 2c example

- ② If \mathbf{x} ='G' belongs to an **internal node**:
 - and both **left** and **right** child nodes of **x** have **exactly** t-1=2 elements, then merge **x** and child nodes, and recursively delete **x**.

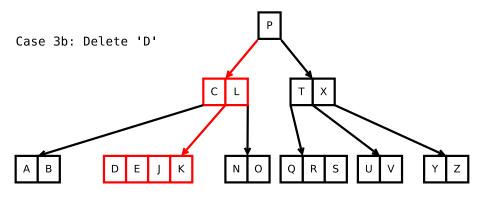






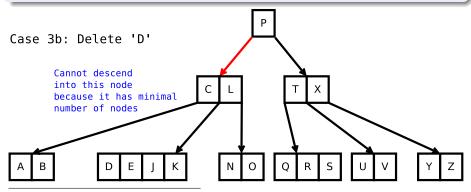


Delete 'D' – Case 3b example*

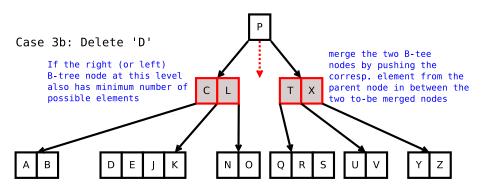


^{*}we will first see case 3b before case 3a, stay tuned!

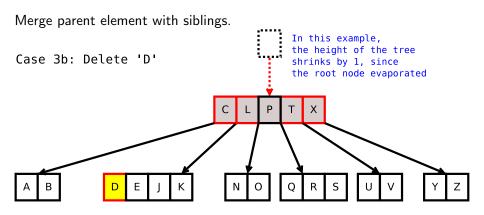
- 3 If the **traversal** is stopped because the 'appropriate' subtree containing \mathbf{x} has a node with **exactly** t-1 elements, then:
 - ullet ..., if its **immediate sibling** also has **exactly** t-1 elements, merge the parent element with both sibling elements to form a single node. This **may** reduce the height of the tree.



^{*}we will first see case 3b before case 3a, stay tuned!



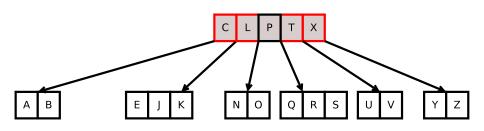
^{*}we will first see case 3b before case 3a, stay tuned!



^{*}we will first see case 3b before case 3a, stay tuned!

Recursively delete 'D'

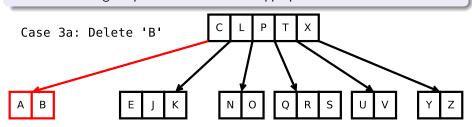
Case 3b: Delete 'D'

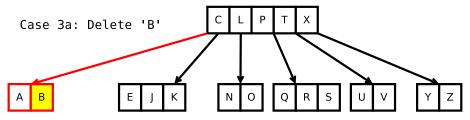


^{*}we will first see case 3b before case 3a, stay tuned!

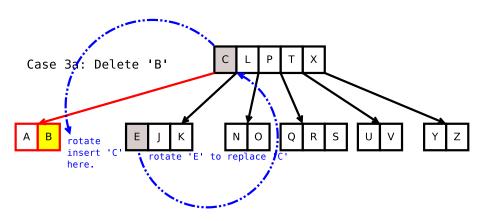
Delete 'B' – Case 3a example

- **3** If the **traversal** is stopped because the 'appropriate' subtree containing \mathbf{x} has a node with **exactly** t-1 elements, then:
 - if this subtree's 'immediate sibling' has at least t elements, give an extra element to the appropriate subtree by rotating the predecessor or successor within the sibling node to its parent, followed by moving the original parent element to the appropriate subtree.

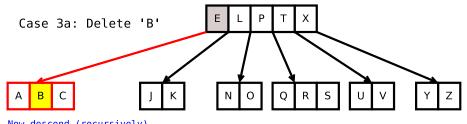




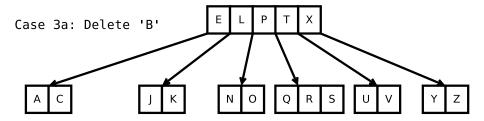
Cannot descend into a minimal node with exactly t-1 elements in it. In this case, 'Immediate sibling' node (to the right ['E','J', 'K']) has at least t elements in it. Rotate the immediate successor ('E') of the parent element 'C' into the parent node, followed by pushing the parent element 'C' into the appropriate ['A','B'] subtree, so that it now has at least t elements. By doing this, the algorithm can descend into this node/subtree.



^{*}Self-study question: How you would handle the case when [E, J, K] (and other currently leaf-level nodes) were all internal nodes of a B-tree and had their own children? Specifically, what would happen to the left-tree (before rotation) of 'E' in such a scenario? Hint: Take inspiration from the rotations you learnt for AVL trees in FIT2004!



Now descend (recursively) into the appropriate subtree and delete 'B'



B- tree – Space and Time complexities

	Average case	Worst case
Time Complexity of operations		
Search	$O(\log(n))$	$O(\log(n))$
Insert	$O(\log(n))$	$O(\log(n))$
Delete	$O(\log(n))$	$O(\log(n))$
Space Complexity		
	O(n)	O(n)

B-Tree Summary

- B-trees are generalizations of balanced search trees
- Designed to optimize access to secondary storage (eg. hard disks).
- \bullet All leaf nodes are at the same height, so insertion and deletion $O(\log(n))\text{-time, all cases}$

coming up...

Week 8: (Semi-)numerical algorithms – Primality testing etc.

Week 9: Lossless compression algorithms - Lempel-Ziv etc.