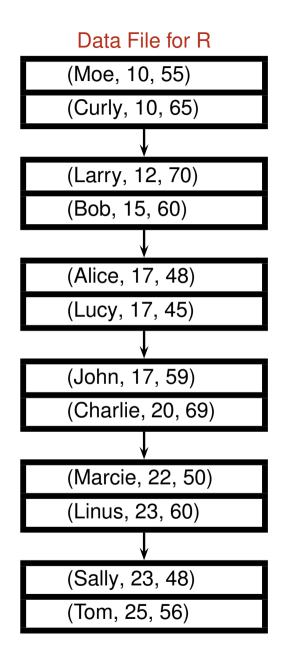
# CS3223 Lecture 2 Indexing

# Example

#### Relation R

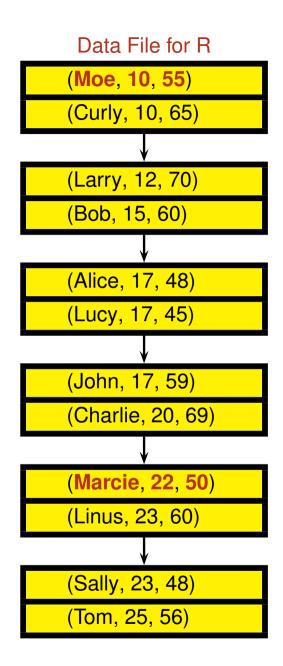
name	age	weight
Moe	10	55
Curly	10	65
Larry	12	70
Bob	15	60
Alice	17	48
Lucy	17	45
John	17	59
Charlie	20	69
Marcie	22	50
Linus	23	60
Sally	23	48
Tom	25	56



# Example

#### Relation R

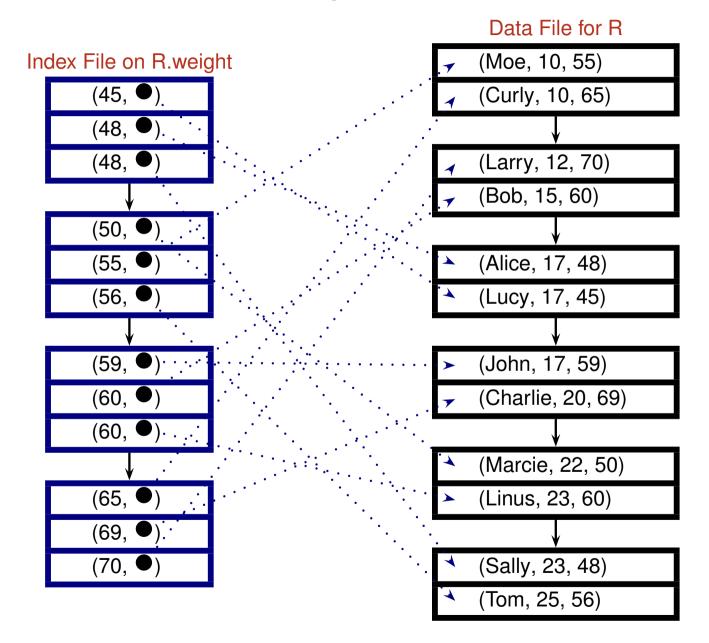
name	age	weight
Moe	10	55
Curly	10	65
Larry	12	70
Bob	15	60
Alice	17	48
Lucy	17	45
John	17	59
Charlie	20	69
Marcie	22	50
Linus	23	60
Sally	23	48
Tom	25	56



SELECT \* FROM R WHERE weight BETWEEN 50 AND 55

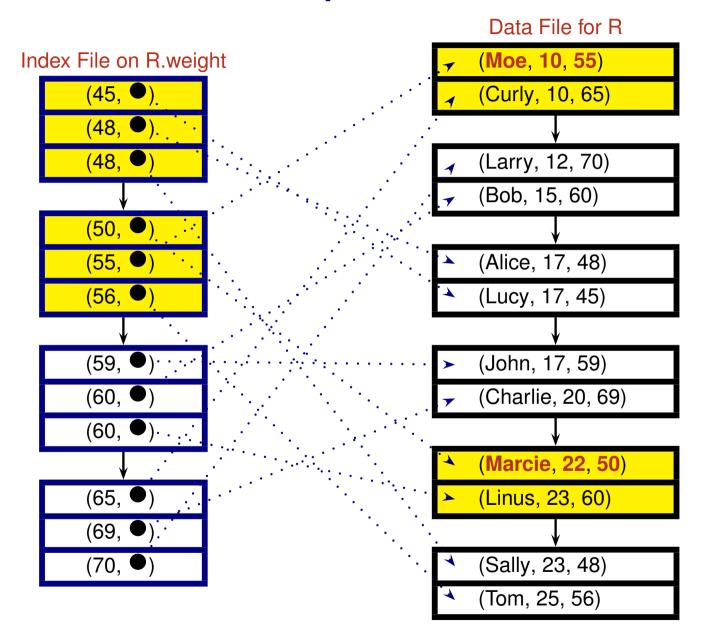
### Index

- An index is a data structure to speed up retrieval of data records based on some search key
- ightharpoonup A search key is a sequence of k data attributes,  $k \ge 1$ 
  - A search key is known as a composite search key if k > 1
  - Example of composite search key: (state, city)
- An index is a unique index if its search key is a candidate key; otherwise, it is a non-unique index
- An index is stored as a file
  - records in an index file are referred to as data entries

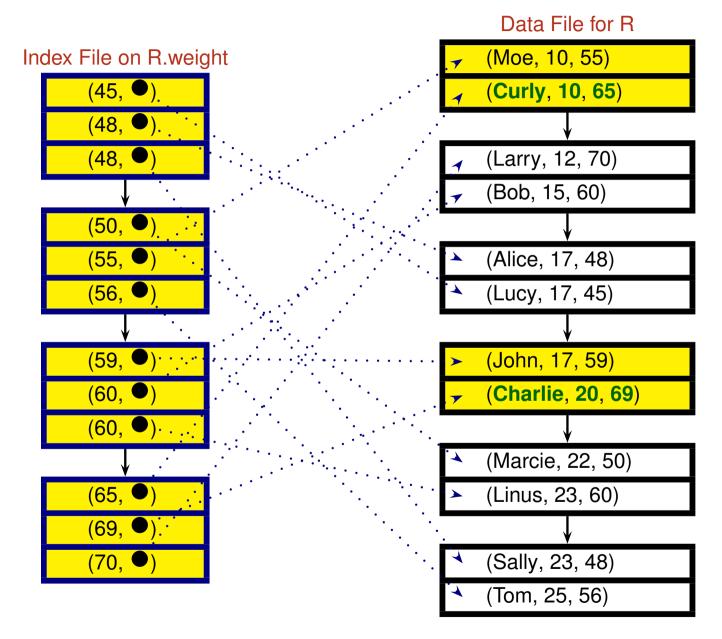


(50, •) is the data entry for the data record (Marcie, 22, 50); • denote a RID value

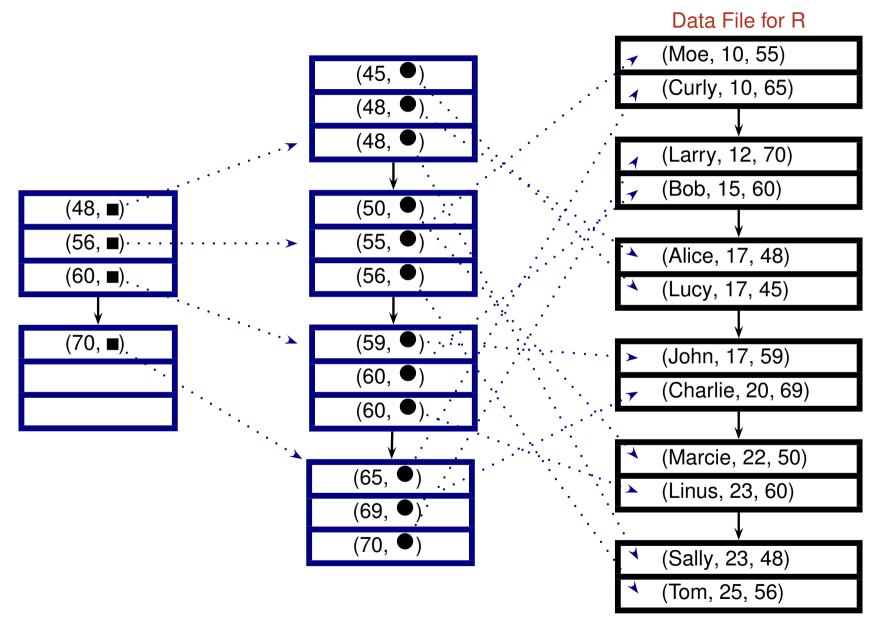
CS3223: Sem 2, 2022/23 Indexing



SELECT \* FROM R WHERE weight BETWEEN 50 AND 55

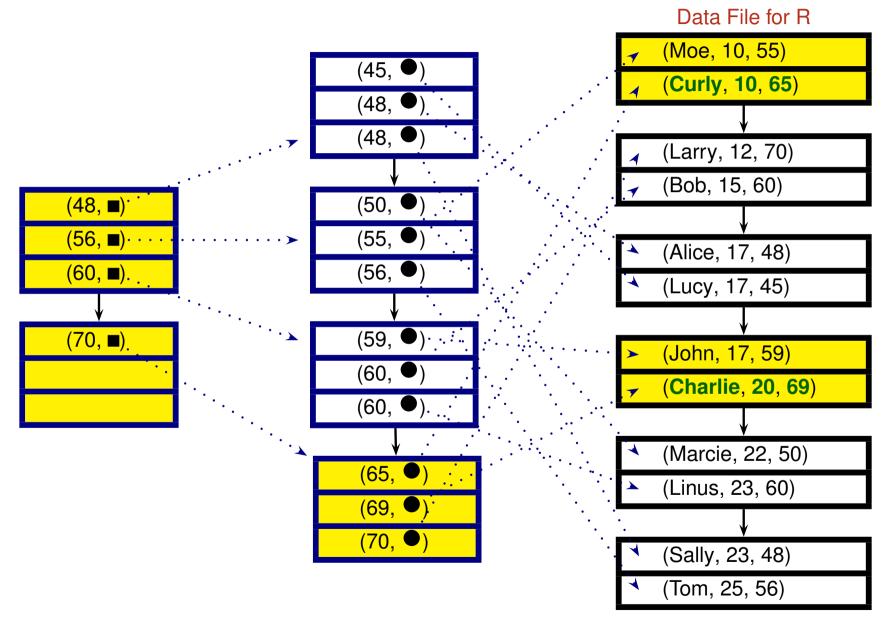


SELECT \* FROM R WHERE weight BETWEEN 65 AND 69

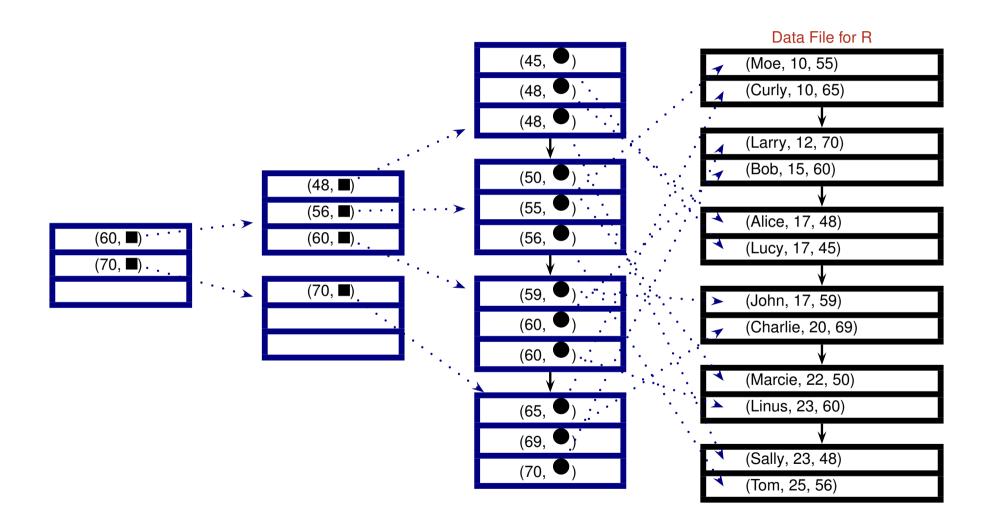


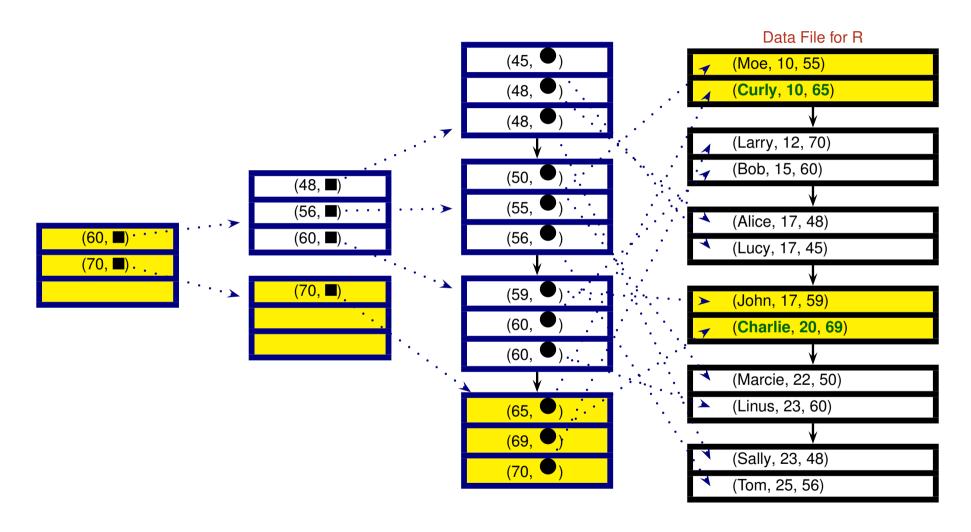
(48, ■) is the index entry for the first page of data entries; ■ denote a disk page address

CS3223: Sem 2, 2022/23 Indexing 5



SELECT \* FROM R WHERE weight BETWEEN 65 AND 69





SELECT \* FROM R WHERE weight BETWEEN 65 AND 69

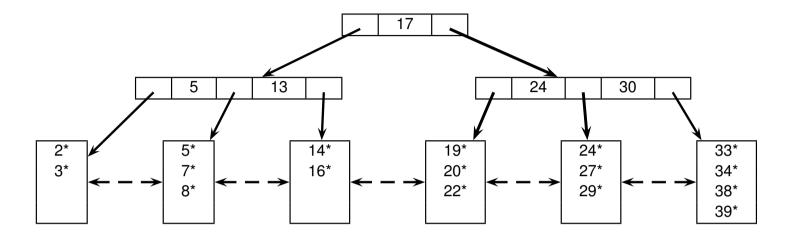
### **Index Types**

- Two main types of indexes:
  - Tree-based index
    - ★ Based on sorting of search key values
    - ★ Examples: ISAM, B<sup>+</sup>-tree
  - Hash-based index
    - ★ Data entries are accessed using hashing function
    - ★ Examples: static hashing, extendible hashing, linear hashing
- Things to consider when choosing an index:
  - Search performance
    - ★ equality search: k = v
    - ★ range search:  $v_1 \le k \le v_2$
  - Storage overhead
  - Update performance

### B<sup>+</sup>-tree Index

**Employee** 

name	deptNo	
Alice	5	
Bob	16	
Charlie	19	
Curly	39	
Dave	38	
Eve	14	
Fred	33	
Harry	2	
John	34	
Kate	8	
Larry	27	
Linus	24	
Lucy	3	
Marcie	22	
Moe	29	
Sally	20	
Tom	7	



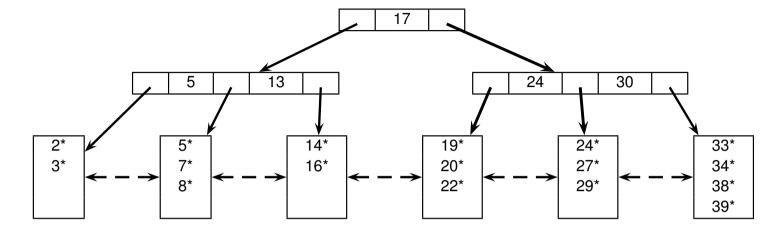
B<sup>+</sup>-tree index on Employee.deptNo

- Leaf nodes store sorted data entries
  - $\triangleright$   $k^*$  denote a data entry of the form (k, RID)
    - ★ k = search key value of corresponding data record
    - ★ RID = RID of corresponding data record
  - Leaf nodes are doubly-linked

### B<sup>+</sup>-tree Index

Employee

Linbioyee			
name	deptNo	• • •	
Alice	5	• • •	
Bob	16		
Charlie	19		
Curly	39		
Dave	38		
Eve	14		
Fred	33		
Harry	2		
John	34		
Kate	8		
Larry	27		
Linus	24		
Lucy	3		
Marcie	22		
Moe	29		
Sally	20		
Tom	7		



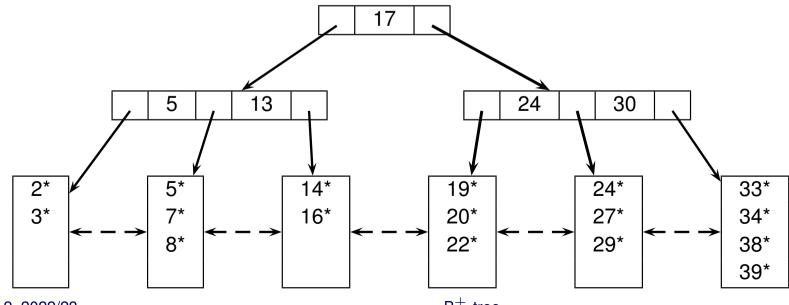
B<sup>+</sup>-tree index on Employee.deptNo

- Internal nodes store index entries of the form  $(p_0, k_1, p_1, k_2, p_2, \dots, p_n)$ 
  - ►  $k_1 < k_2 < \cdots < k_n$
  - $p_i$  = disk page address (root node of an index subtree  $T_i$ )
  - For each data entry  $k^*$  in  $T_0$ ,  $k < k_1$
  - For each data entry  $k^*$  in  $T_i$  ( $i \in [1, n)$ ),  $k \in [k_i, k_{i+1})$
  - For each data entry  $k^*$  in  $T_n$ ,  $k \ge k_n$
- Each  $(k_i, p_i)$  is an index entry;  $k_i$  serves as a separator between the node contents pointed to by  $p_{i-1} \& p_i$

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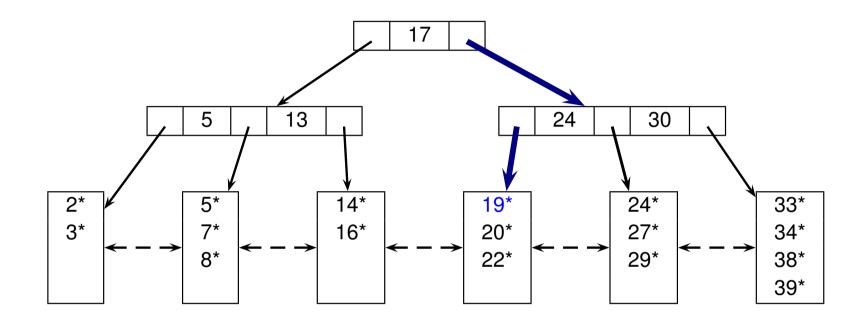
### Properties of B<sup>+</sup>-tree Index

- Dynamic index structure; adapts to data updates gracefully
- Height-balanced index structure
- ▶ Order of index tree,  $d \in Z^+$ 
  - 1. Controls space utilization of index nodes
  - 2. Each non-root node contains m entries, where  $m \in [d, 2d]$
  - 3. The root node contains m entries, where  $m \in [1, 2d]$
- **Example:**  $B^+$ -tree with order = 2



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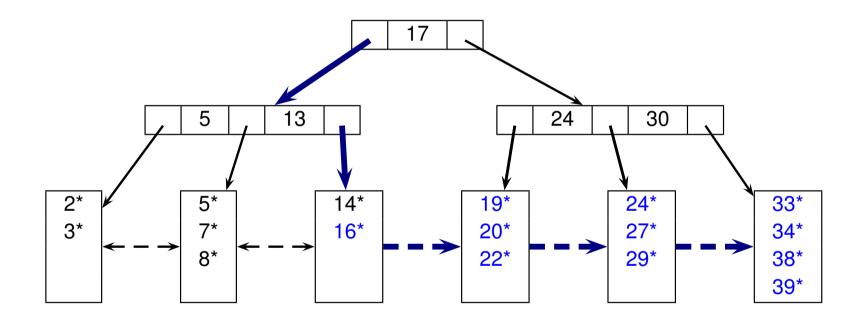
# Equality Search (k = 19)



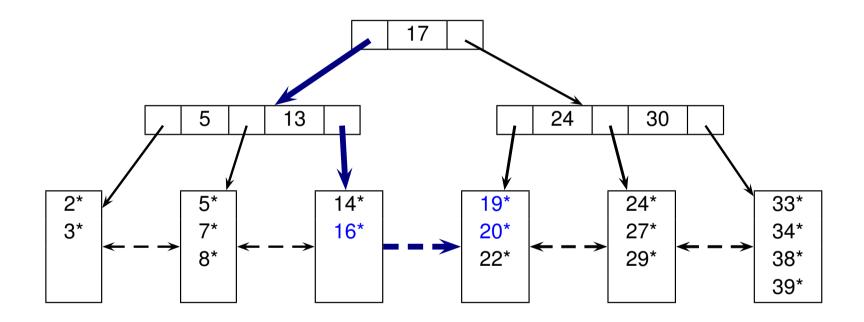
- At each internal node N, find the largest key  $k_i$  in N s.t.  $k \ge k_i$ 
  - If  $k_i$  exists, then search subtree at  $p_i$
  - Otherwise, search subtree at  $p_0$

CS3223: Sem 2, 2022/23 B<sup>+</sup>-tree: Searching 10

# Range Search ( $k \ge 15$ )



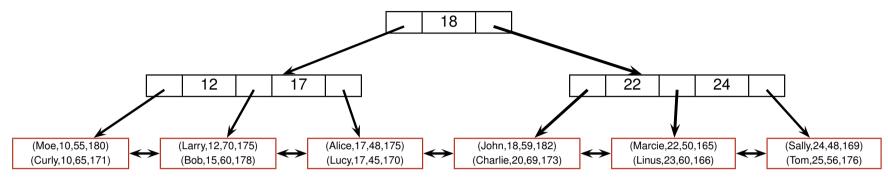
# Range Search (15 $\leq k \leq$ 21)



### Formats of Data Entries

- Three different formats for data entries:
  - Format 1: k\* is an actual data record (with search key value k)
  - Format 2: k\* is of the form (k, rid), where *rid* is the record identifier of a data record with search key value *k*
  - Format 3: k\* is of the form (k, rid-list), where *rid-list* is a list of record identifiers of data records with search key value *k*
- So far, our examples assume Format 2.

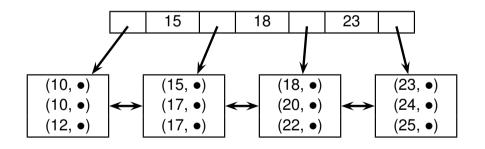
### Formats of Data Entries: Example



B<sup>+</sup>-tree index on R.age (Format 1)

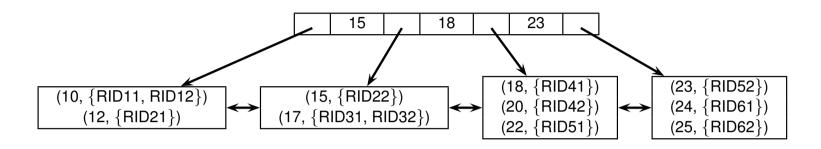
#### **Relation R**

name	age	weight	height
Moe	10	55	180
Curly	10	65	171
Larry	12	70	175
Bob	15	60	178
Alice	17	48	175
Lucy	17	45	170
John	18	59	182
Charlie	20	69	173
Marcie	22	50	165
Linus	23	60	166
Sally	24	48	169
Tom	25	56	176



B<sup>+</sup>-tree index on R.age (Format 2)

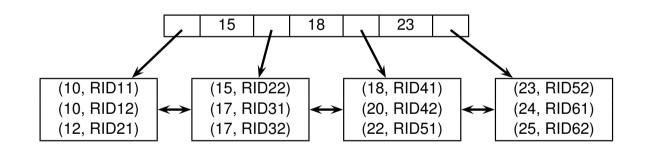
### Format 2 vs Format 3 Index



### Index on R.age (format 3)

#### Relation R

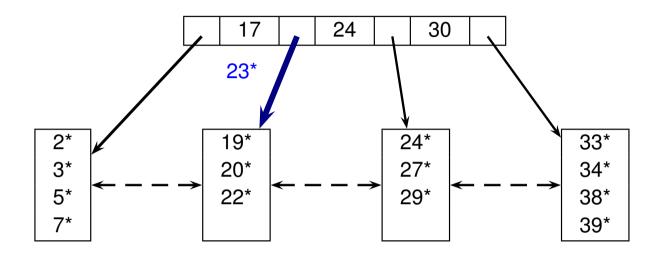
name	age	weight	height
Moe	10	55	180
Curly	10	65	171
Larry	12	70	175
Bob	15	60	178
Alice	17	48	175
Lucy	17	45	170
John	18	59	182
Charlie	20	69	173
Marcie	22	50	165
Linus	23	60	166
Sally	24	48	169
Tom	25	56	176



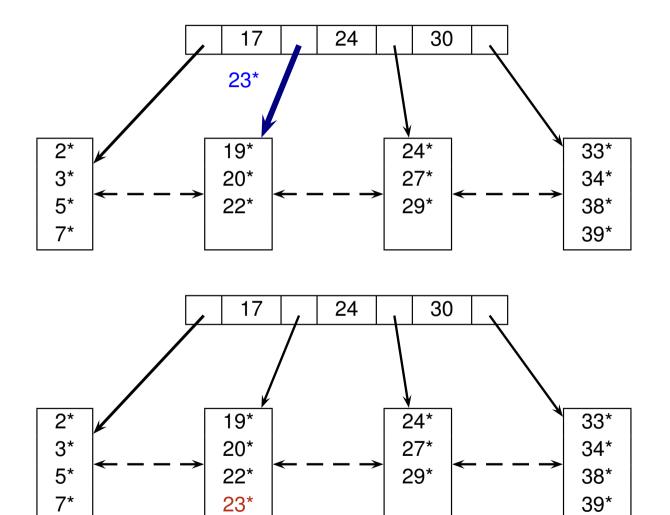
Index on R.age (format 2)

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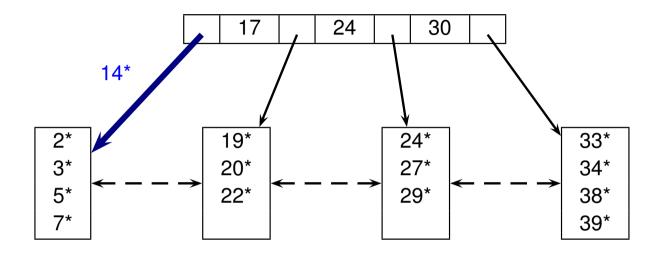
# Inserting 23\* (Simple Case)



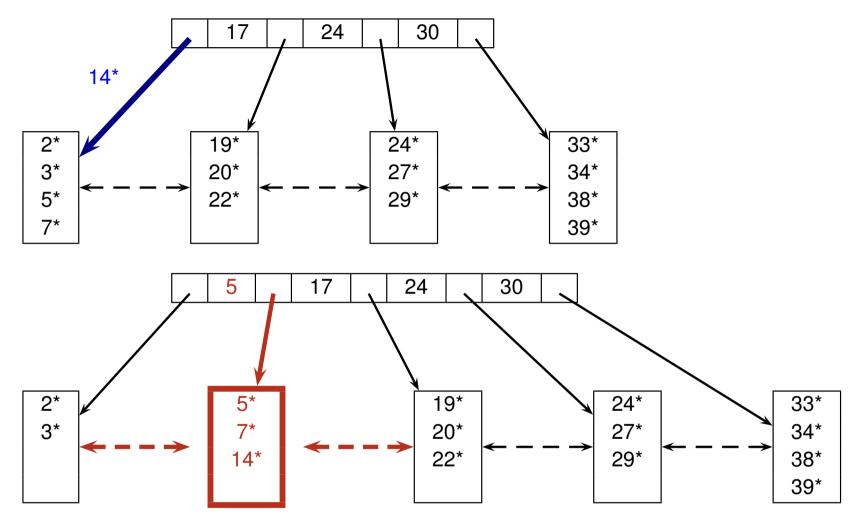
# Inserting 23\* (Simple Case)



### Inserting 14\* (Splitting of overflowed node)

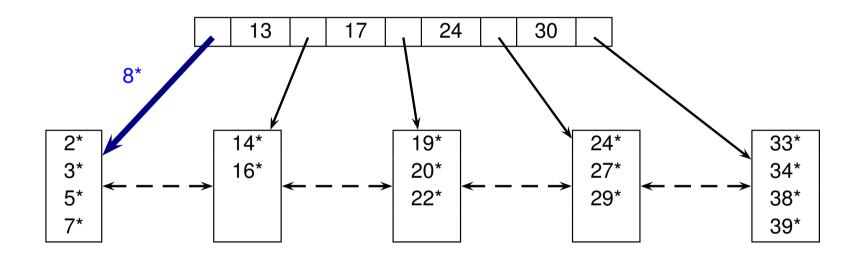


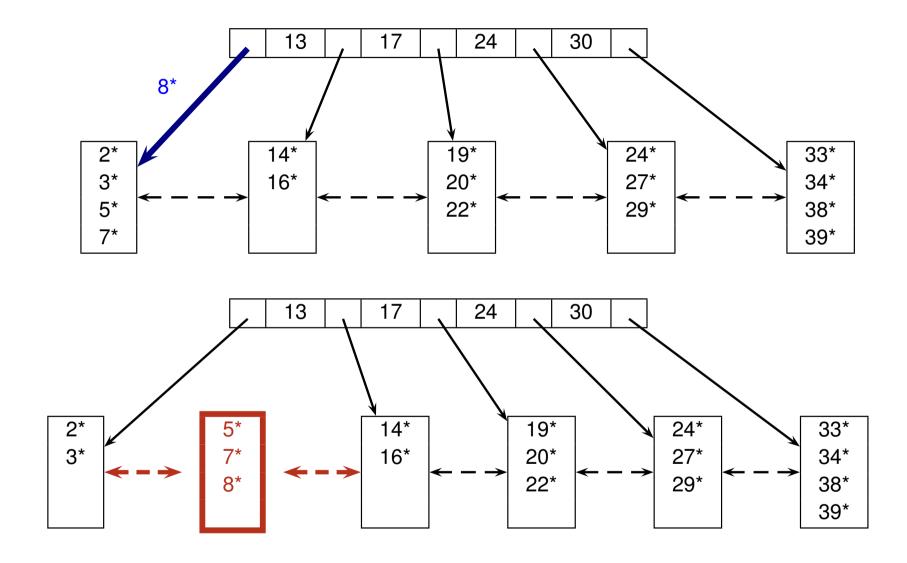
### Inserting 14\* (Splitting of overflowed node)



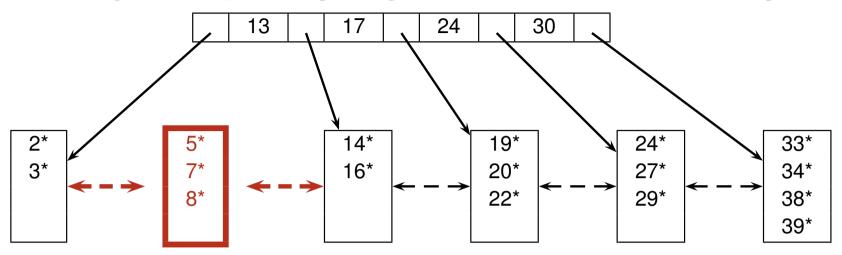
- ► Split overflowed leaf node by distributing **d+1** entries to new leaf node
- Create a new index entry using the smallest key in new leaf node
- Insert new index entry into parent node of overflowed node

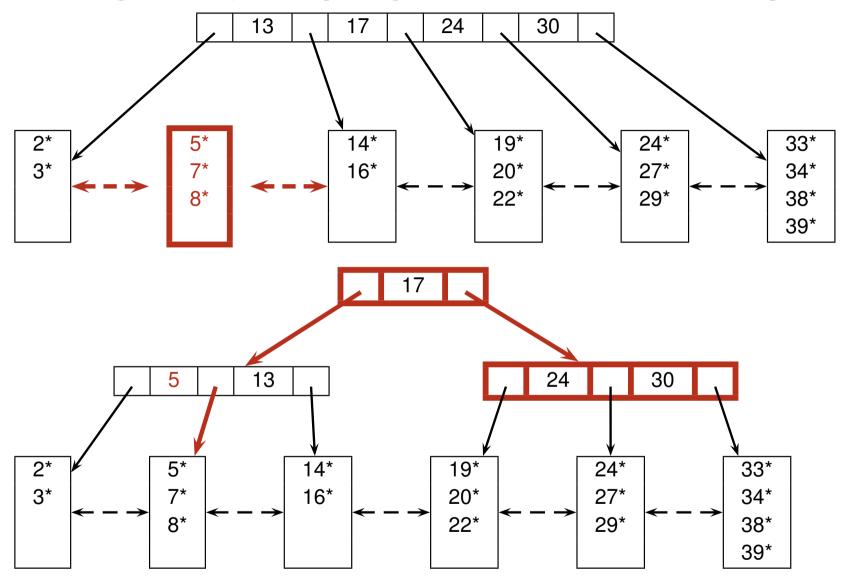
CS3223: Sem 2, 2022/23 B<sup>+</sup>-tree: Insertion 17





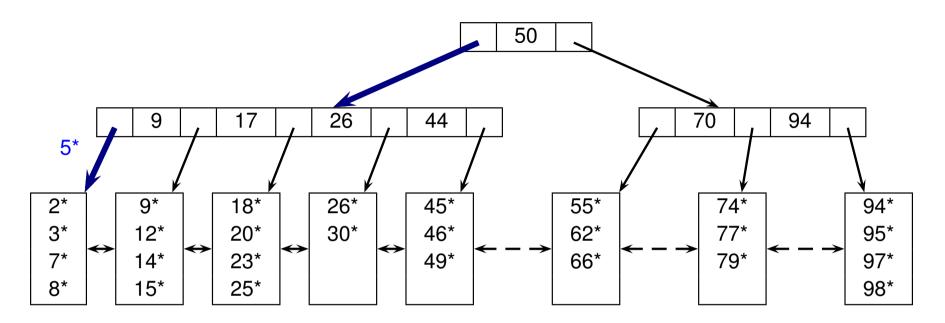
Node splits can be propagated to ancestor internal nodes

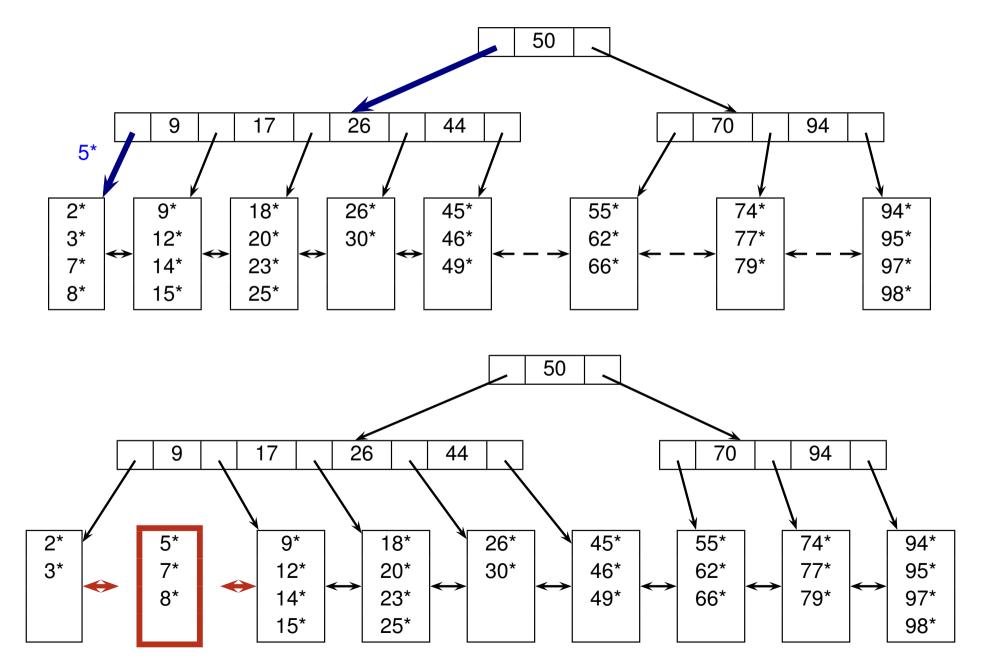


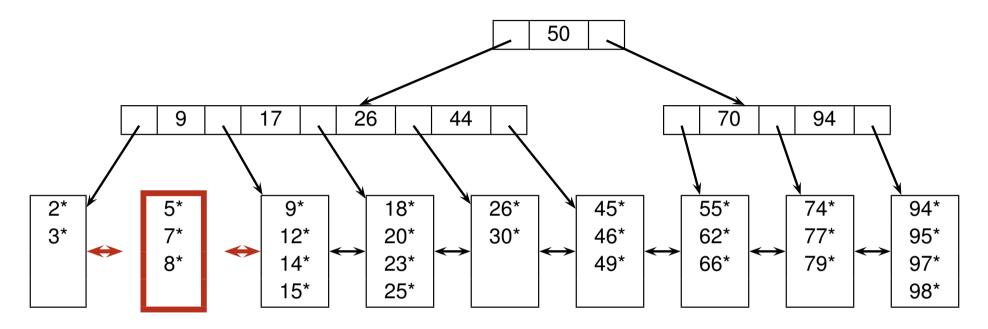


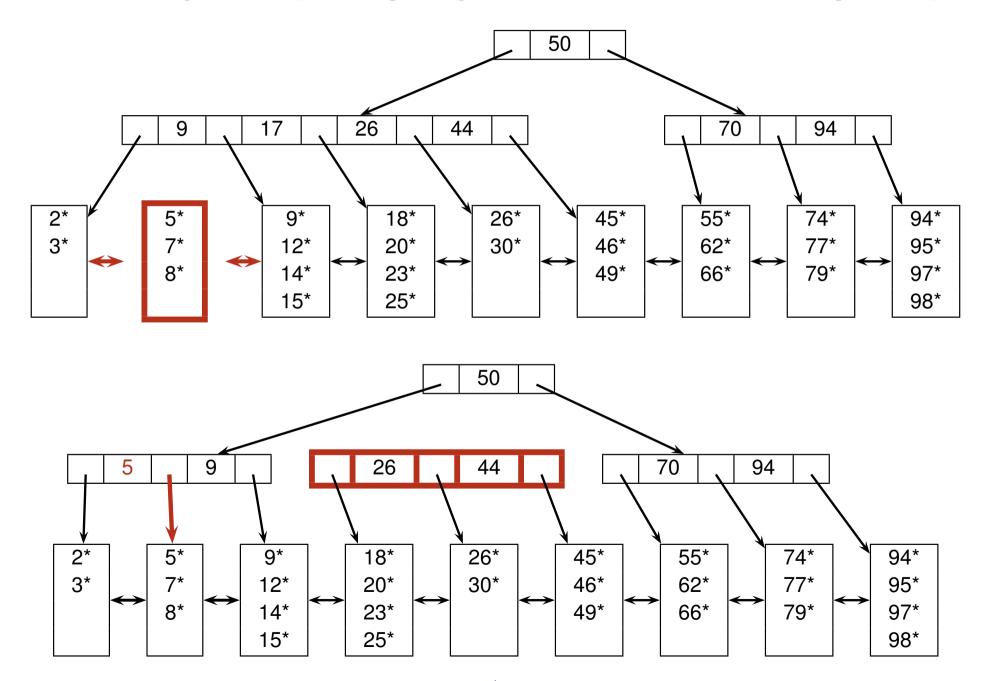
When splitting an internal node, the middle key is pushed up to parent node CS3223: Sem 2, 2022/23

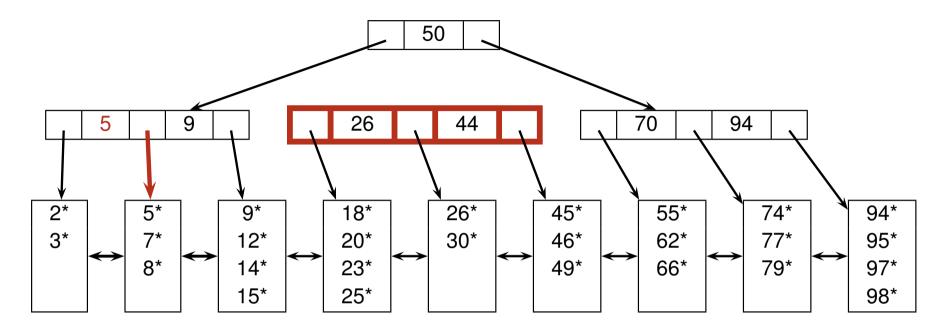
B<sup>+</sup>-tree: Insertion 19

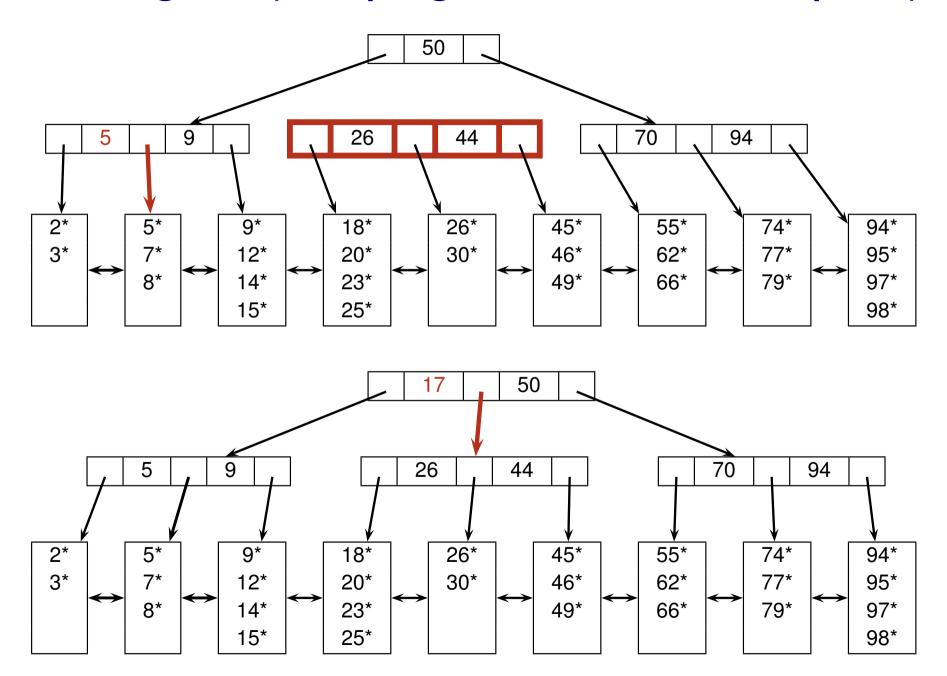






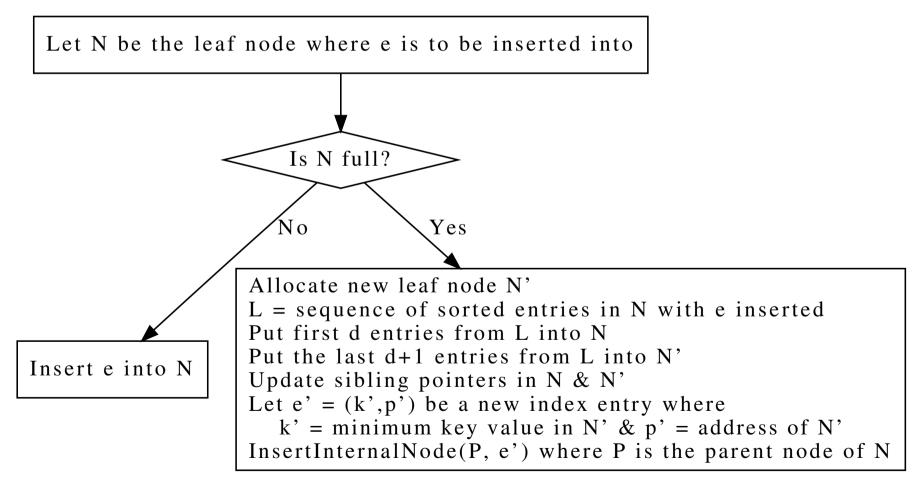






# B<sup>+</sup>-tree: Insertion Algorithm

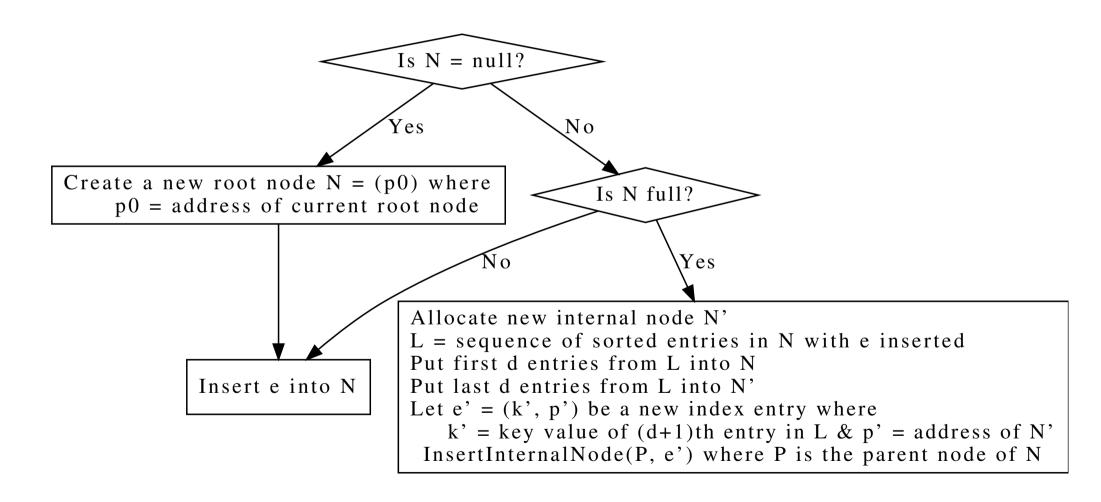
 $\mathbf{d}$  = order of index,  $\mathbf{e}$  = new data entry to be inserted into index



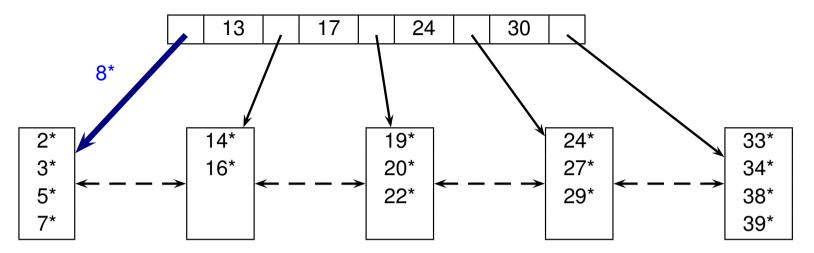
Note: The parent node of a root node is null

## InsertInternalNode(N, e)

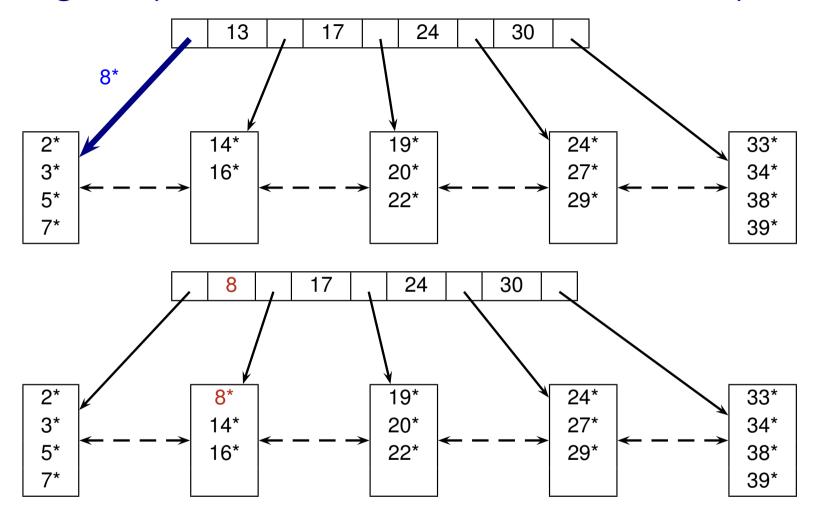
Insert index entry **e** into internal index node **N d** = order of index



#### Inserting 8\* (Redistribution of data entries)



#### Inserting 8\* (Redistribution of data entries)



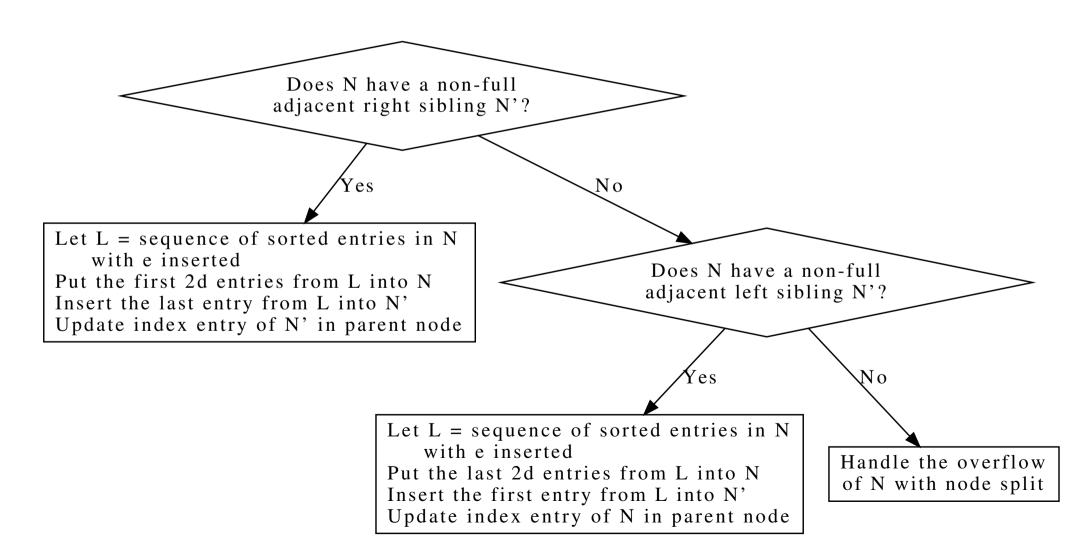
- A node split can sometimes be avoided by distributing entries from overflowed node to a non-full adjacent sibling node
- Two nodes at the same level are sibling nodes if they have the same parent node

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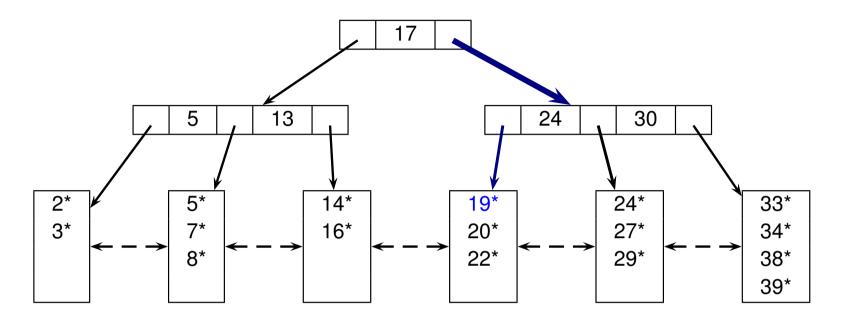
#### Redistribution of data entries (in leaf nodes)

**e** = new data entry to be inserted into a full leaf node **N** 

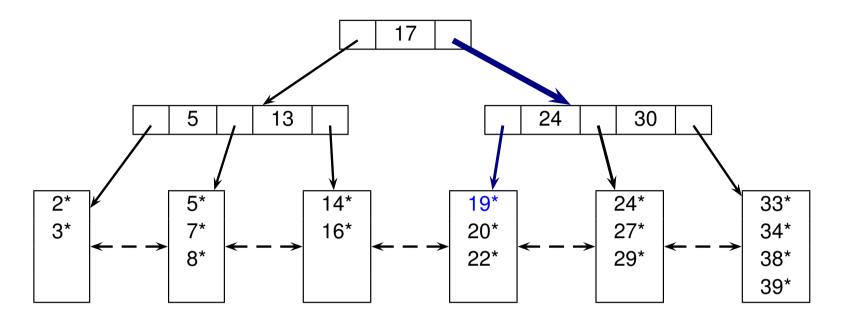
 $\mathbf{d}$  = order of index

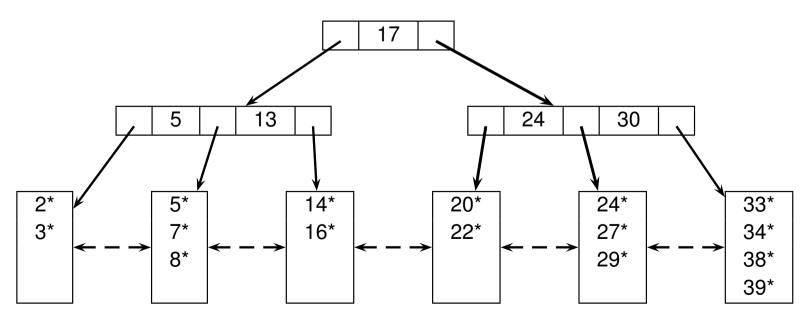


## Deleting 19\* (Simple Case)



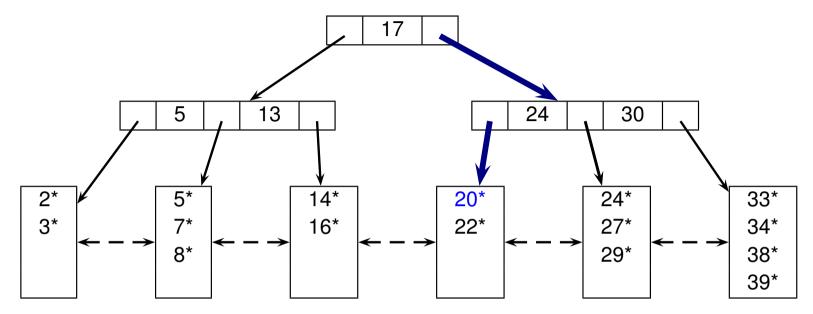
## Deleting 19\* (Simple Case)



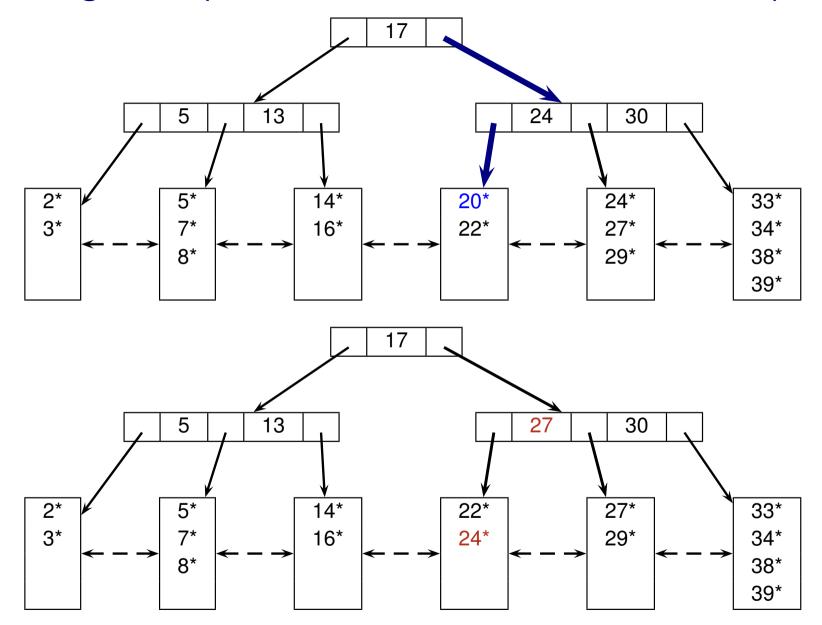


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#### Deleting 20\* (Redistribution of leaf entries)



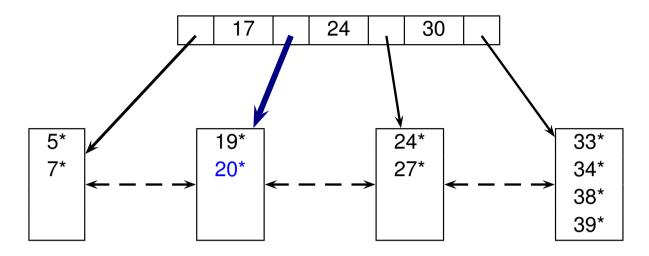
#### Deleting 20\* (Redistribution of leaf entries)



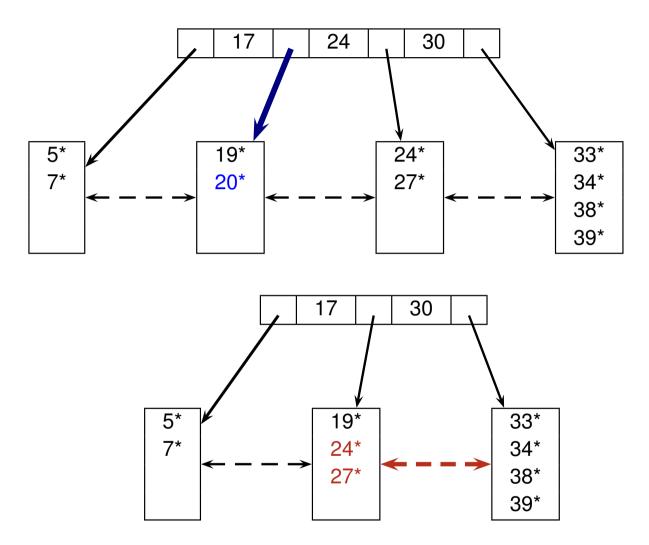
An underflowed node could be balanced using an adjacent sibling's entry

CS3223: Sem 2, 2022/23 B<sup>+</sup>-tree: Deletion 28

## Deleting 20\* (Merging of nodes)

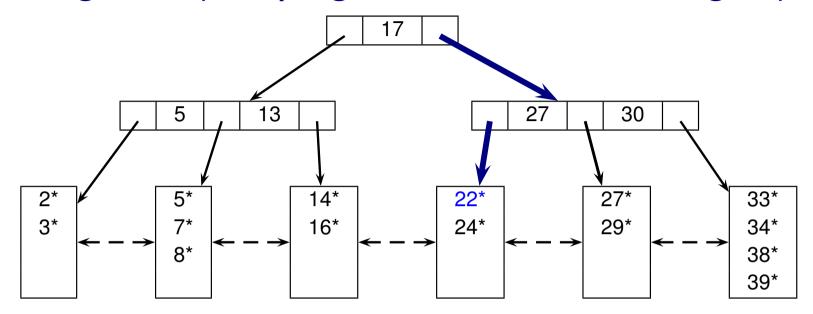


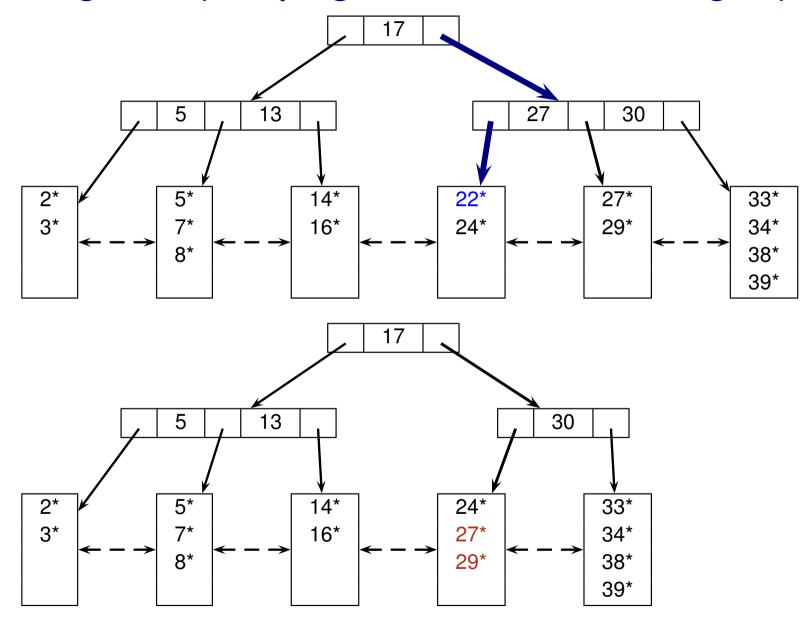
## Deleting 20\* (Merging of nodes)



An underflowed node needs to be merged if each of its adjacent sibling nodes has exactly *d* entries (d = order)

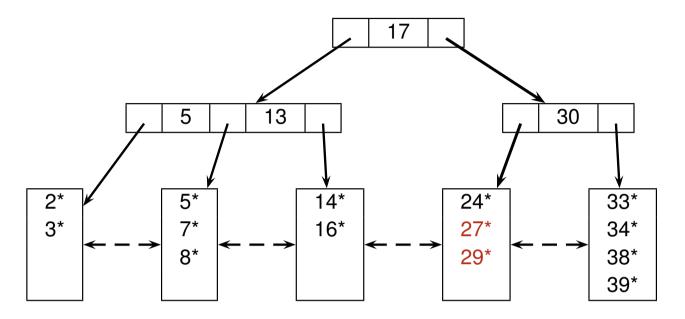
CS3223: Sem 2, 2022/23 B<sup>+</sup>-tree: Deletion 29

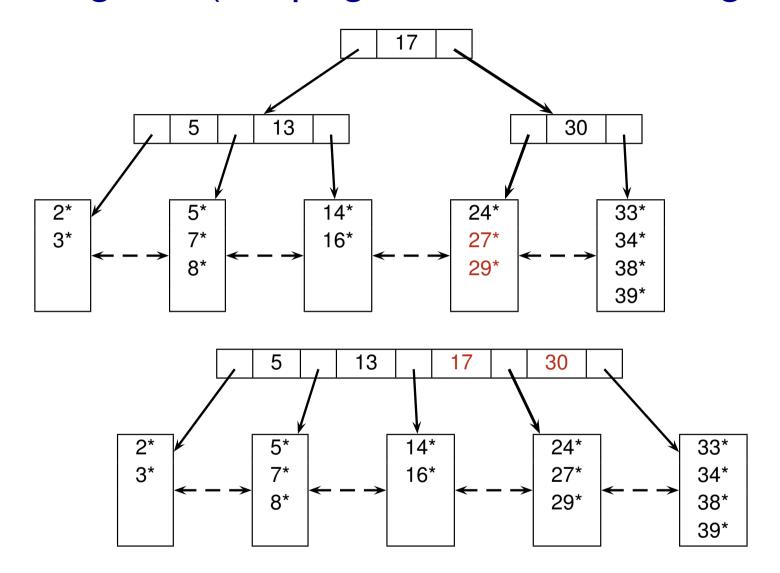




Node merges can be propagated to ancestor nodes

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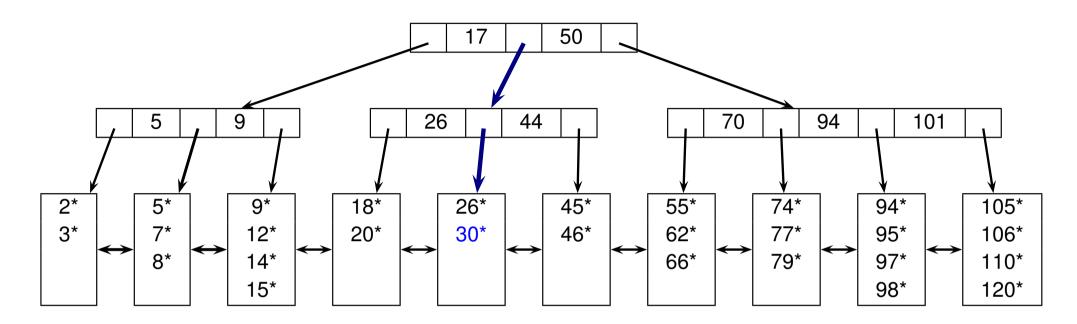




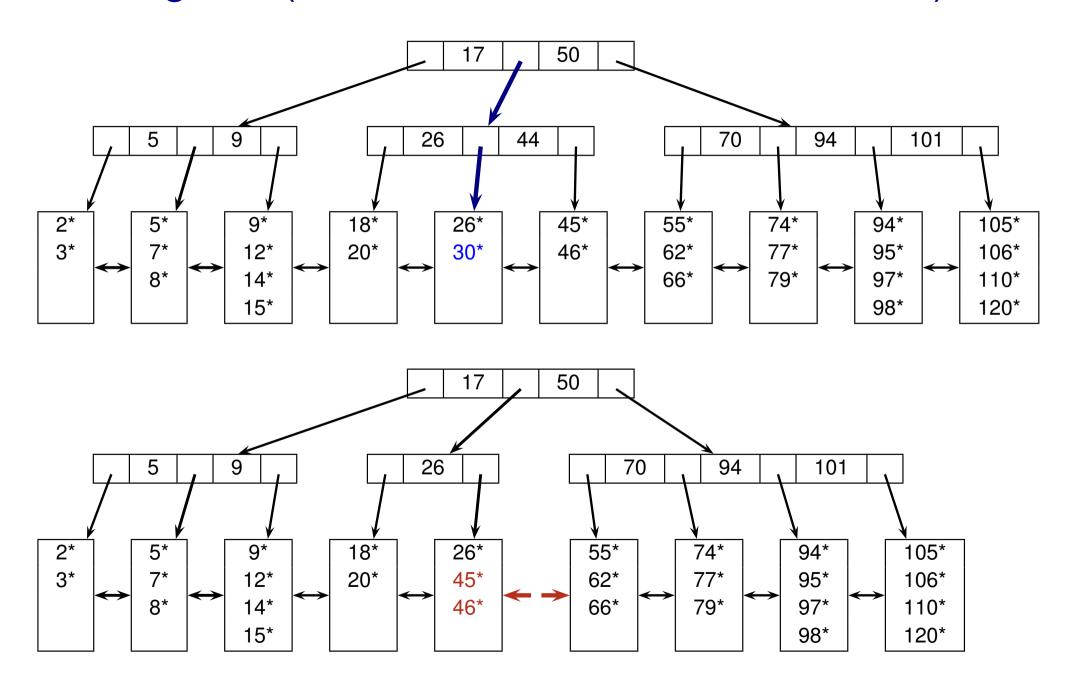
Pull down appropriate key from parent node to form merged node

CS3223: Sem 2, 2022/23 B<sup>+</sup>-tree: Deletion 31

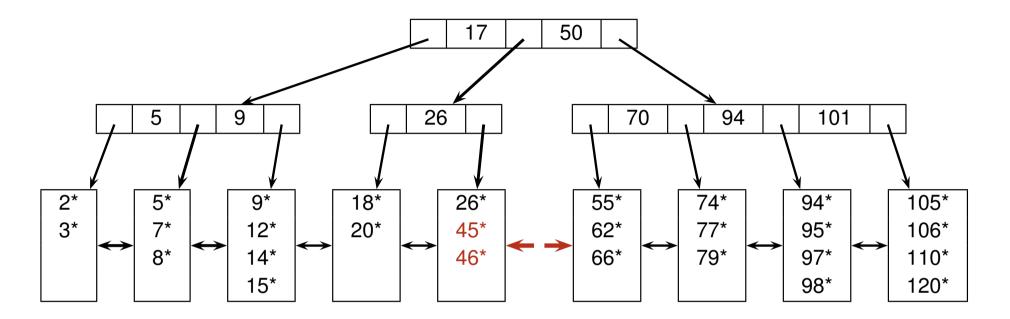
#### Deleting 30\* (Redistribution of internal entries)



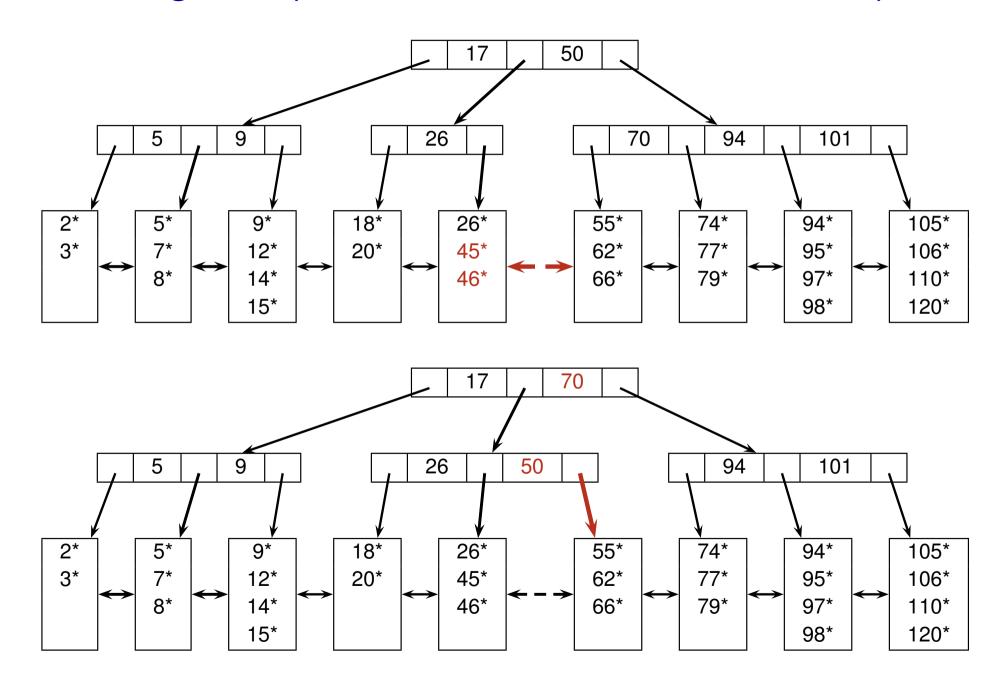
#### Deleting 30\* (Redistribution of internal entries)



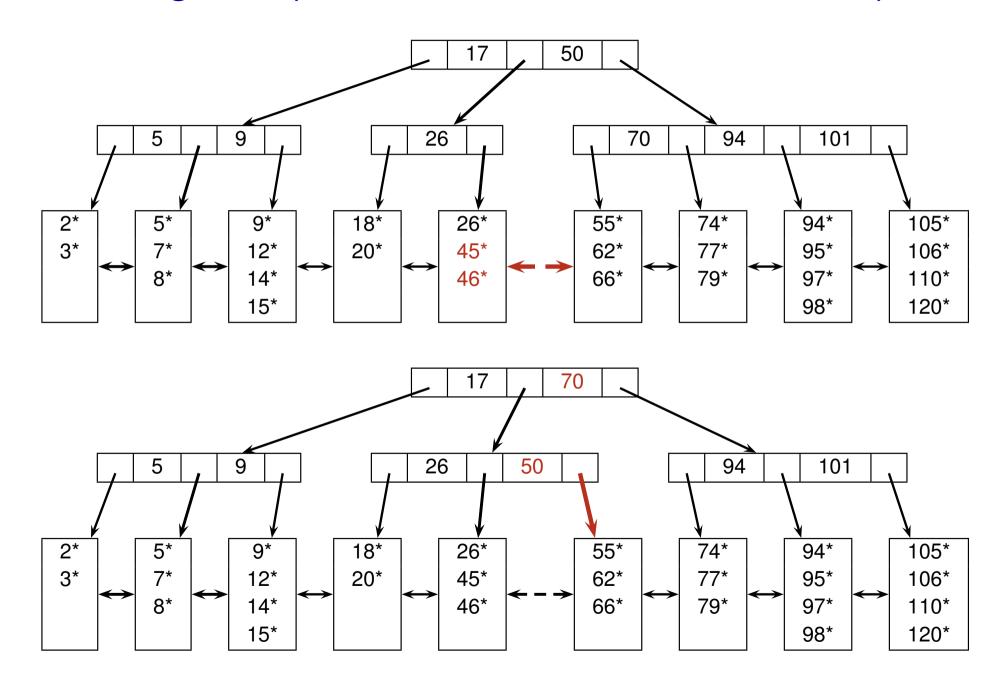
#### Deleting 30\* (Redistribution of data entries)



#### Deleting 30\* (Redistribution of data entries)

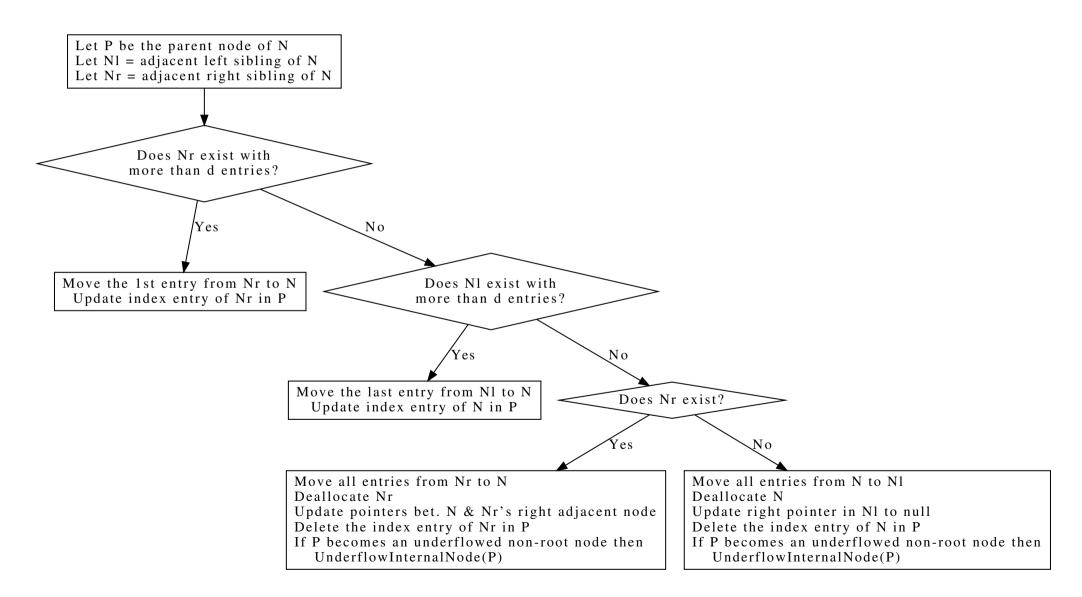


#### Deleting 30\* (Redistribution of data entries)

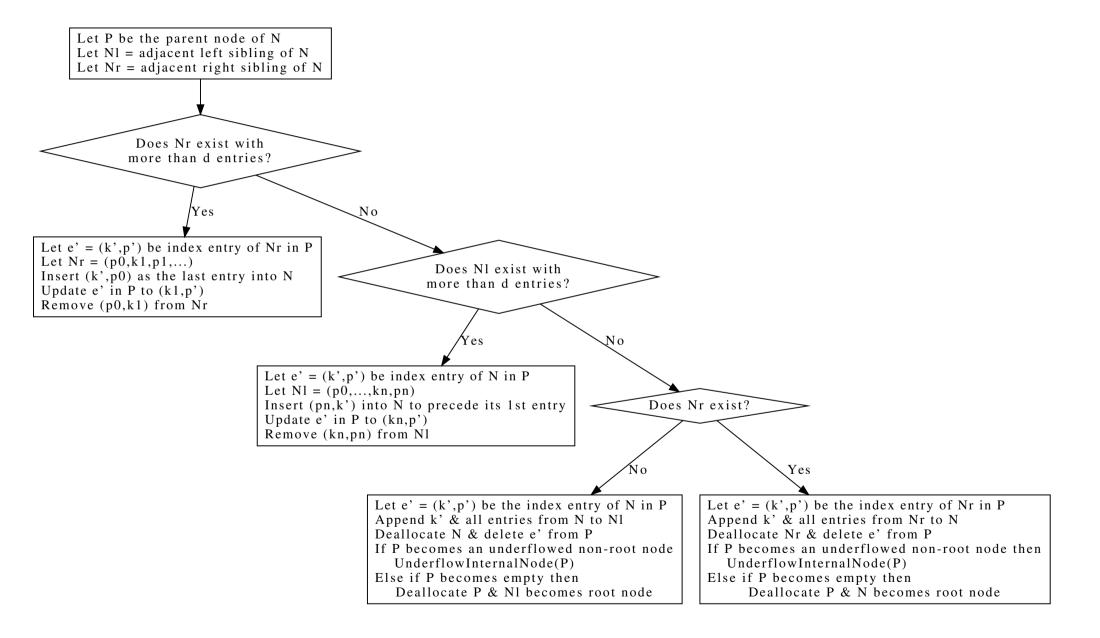


## B<sup>+</sup>-tree: Deletion Algorithm

N = non-root leaf node that underflows after deletion of a data entry Assume redistribution is attempted whenever possible

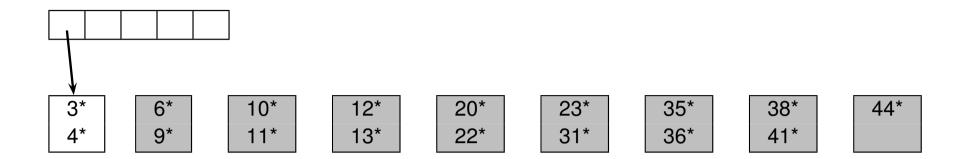


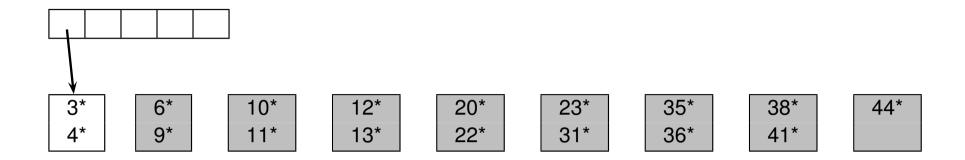
### UnderflowInternalNode(N)

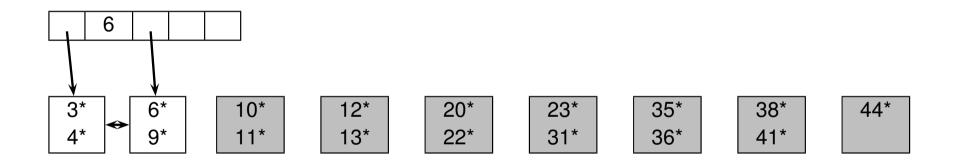


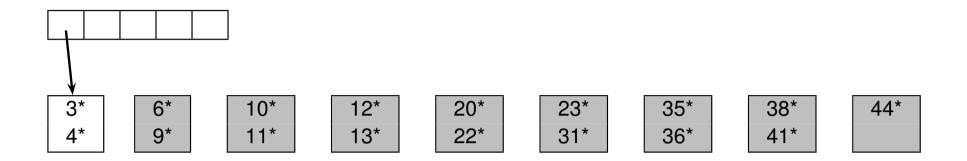
## Bulk Loading a B<sup>+</sup>-tree

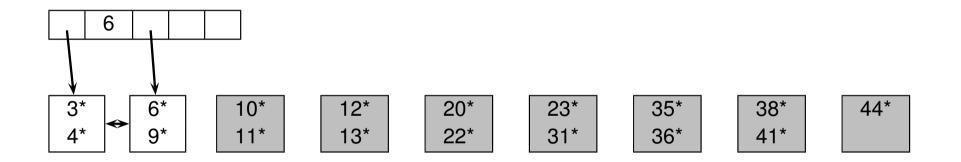
- ► How to build a B<sup>+</sup>-tree index on a collection of records?
  - 1. Simple approach: insert records into B<sup>+</sup>-tree one at a time
  - 2. Alternative approach: bulk load B<sup>+</sup>-tree
- ➤ Steps to bulk load a B<sup>+</sup>-tree :
  - 1. Sort the data entries to be inserted by search key
  - 2. Load the leaf pages of B<sup>+</sup>-tree with sorted entries
  - 3. Initialize B<sup>+</sup>-tree with an empty root page
  - 4. For each leaf page (in sequential order), insert its index entry into the rightmost parent-of-leaf level page of B<sup>+</sup>-tree
- Advantages of bulk loading:
  - Efficient construction algorithm
  - Leaf pages are allocated sequentially

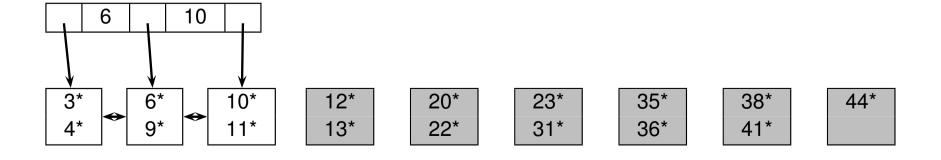


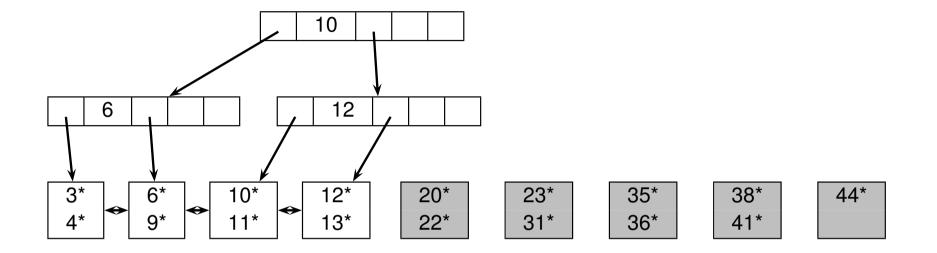


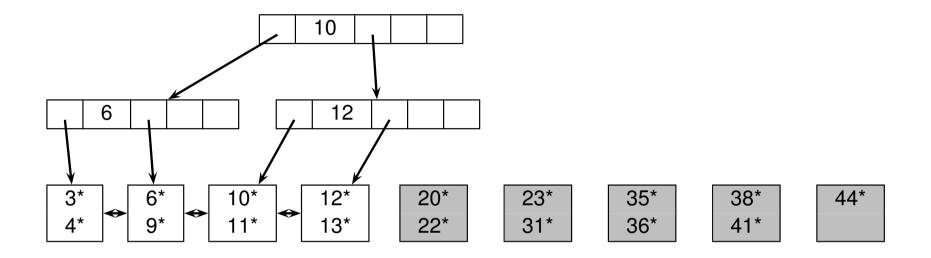


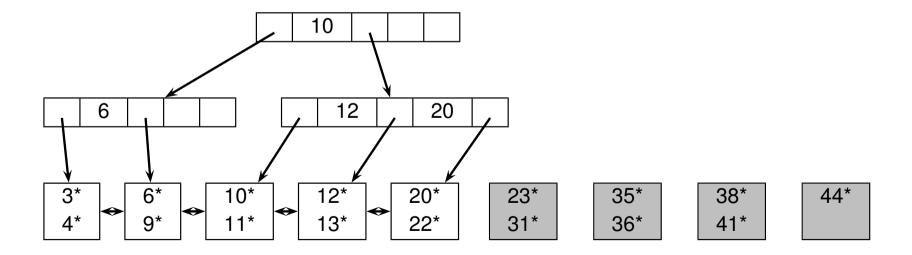


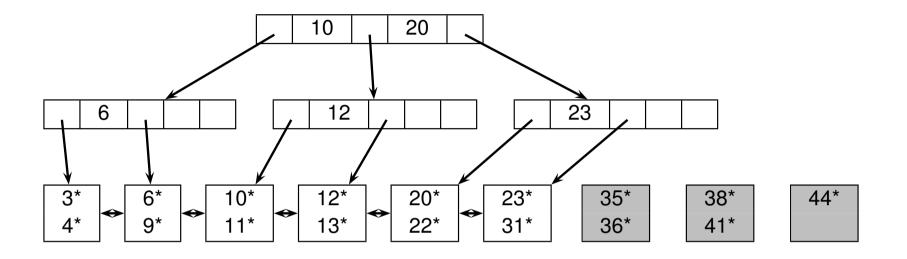


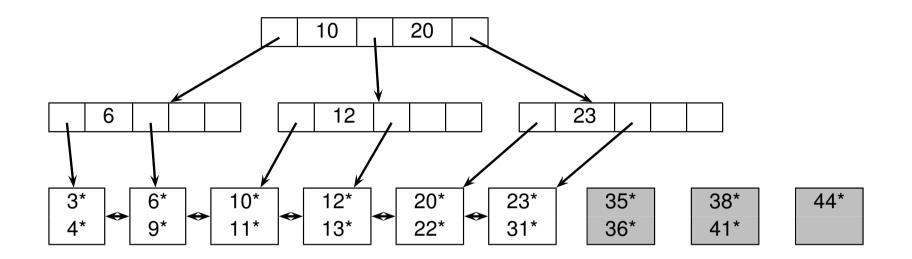


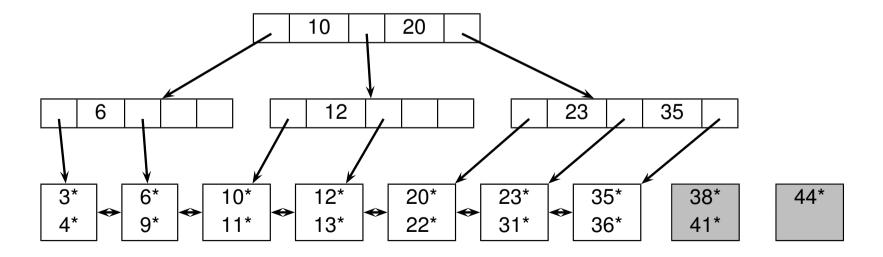


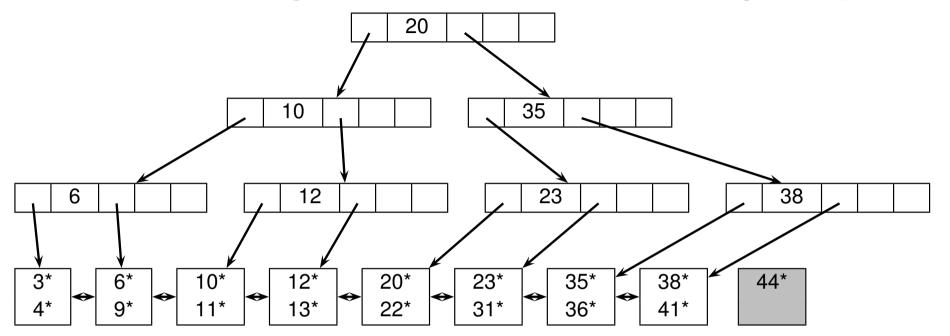


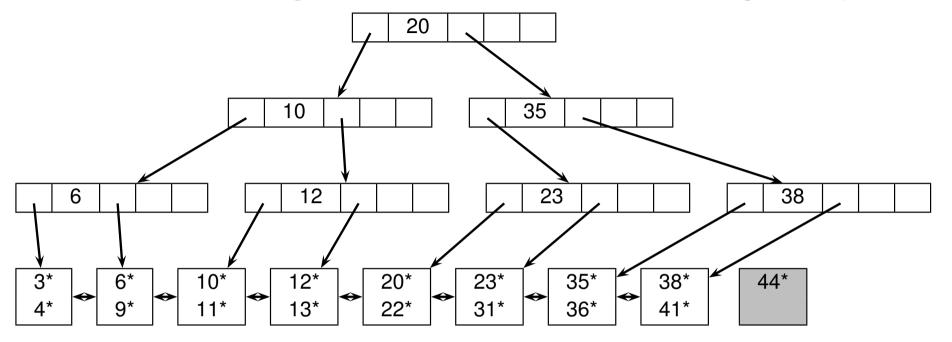


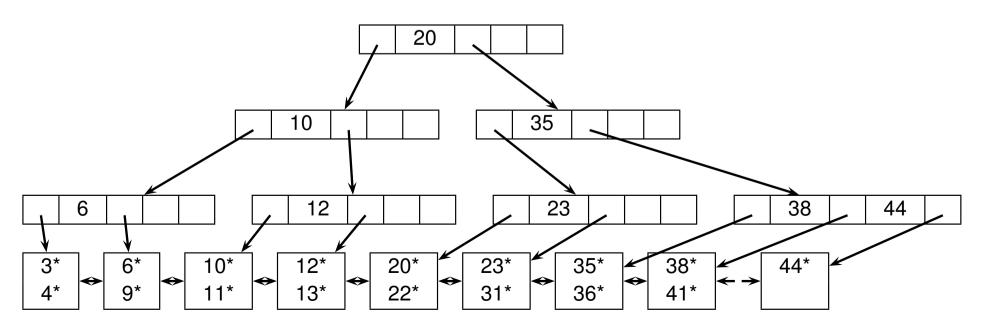








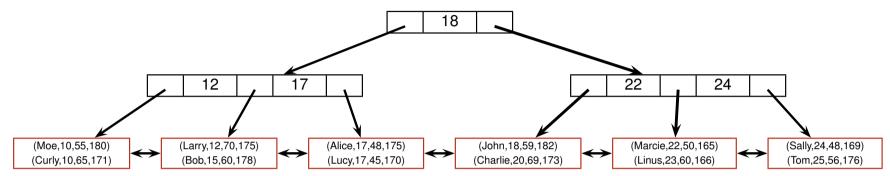




#### Clustered vs Unclustered Index

- An index is a clustered index if the order of its data entries is the same as or 'close to' the order of the data records; otherwise, it is an unclustered index
- An index using Format 1 for its data entries is a clustered index
- There is at most one clustered index for each relation

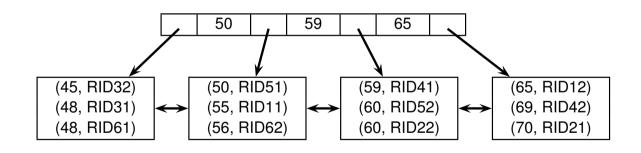
#### Clustered vs Unclustered Index: Example



Clustered index on R.age

#### Relation R

name	age	weight	height
Moe	10	55	180
Curly	10	65	171
Larry	12	70	175
Bob	15	60	178
Alice	17	48	175
Lucy	17	45	170
John	18	59	182
Charlie	20	69	173
Marcie	22	50	165
Linus	23	60	166
Sally	24	48	169
Tom	25	56	176



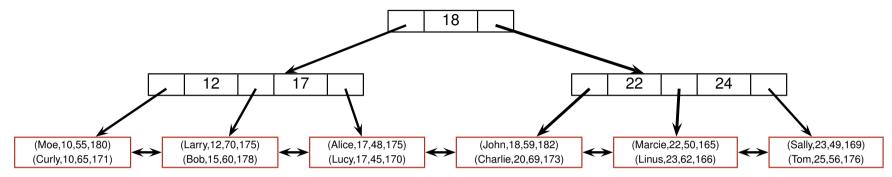
#### Unclustered index on R.weight

(RIDij = slot j on data page i)

#### Dense vs Sparse Index

- An index is a dense index if there is an index record for every search key value in the data; otherwise, it is a sparse index
  - Unclustered index must be dense

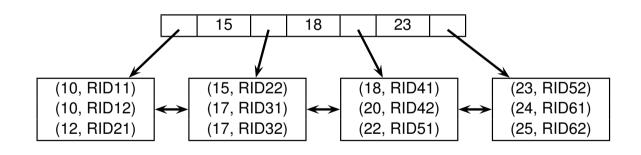
### Dense vs Sparse Index: Example



Sparse clustered index on R.age

#### Relation R

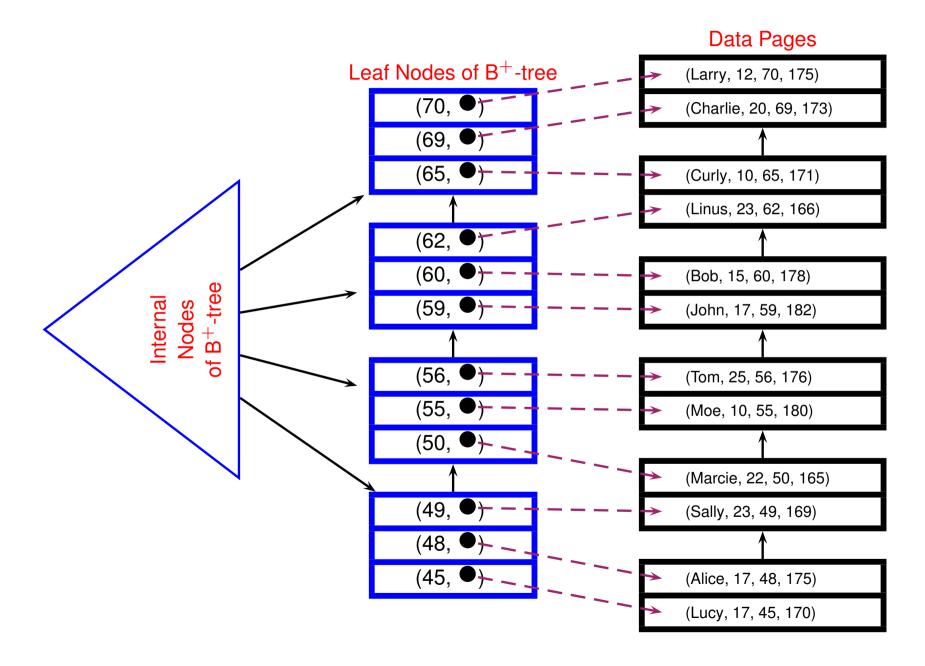
name	age	weight	height
Moe	10	55	180
Curly	10	65	171
Larry	12	70	175
Bob	15	60	178
Alice	17	48	175
Lucy	17	45	170
John	18	59	182
Charlie	20	69	173
Marcie	22	50	165
Linus	23	62	166
Sally	24	49	169
Tom	25	56	176



#### Dense clustered index on R.age

(RIDij = slot j on data page i)

## Clustered & Dense B<sup>+</sup>-tree on R.weight



## Unclustered & Dense B<sup>+</sup>-tree on R.weight

