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Access Structures

COMP3211 Advanced Databases

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Overview

- Index basics
  - Sequential files
  - Dense indexes
  - Sparse indexes
  - Multi-level indexes
  - Secondary indexes
  - Indirection
- B+trees
- Hash tables

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Index Basics

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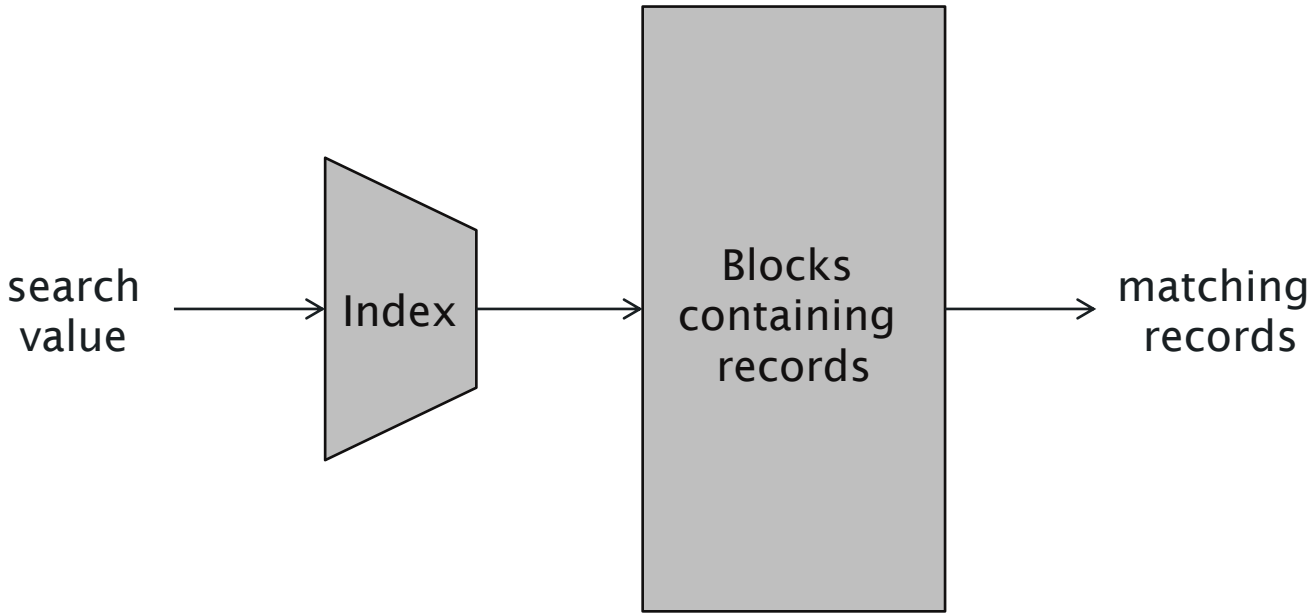
Index basics

- Relations are stored in files
- Files are stored as collections of blocks
- Blocks contain records that correspond to tuples in the relation

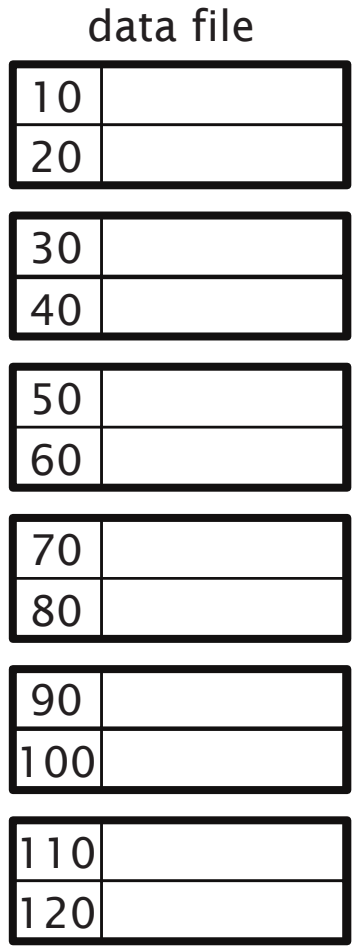
- How do we find the tuples that match some criteria?

Indexes


search value
Index
Blocks containing records
matching records

Sequential Files

- Tuples of a relation are sorted by their primary key
- Tuples are then distributed among blocks in that order
- Common to leave free space in each block to allow for later insertions



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To Index or Not To Index?

Maintaining an index costs time (processor, disk access)

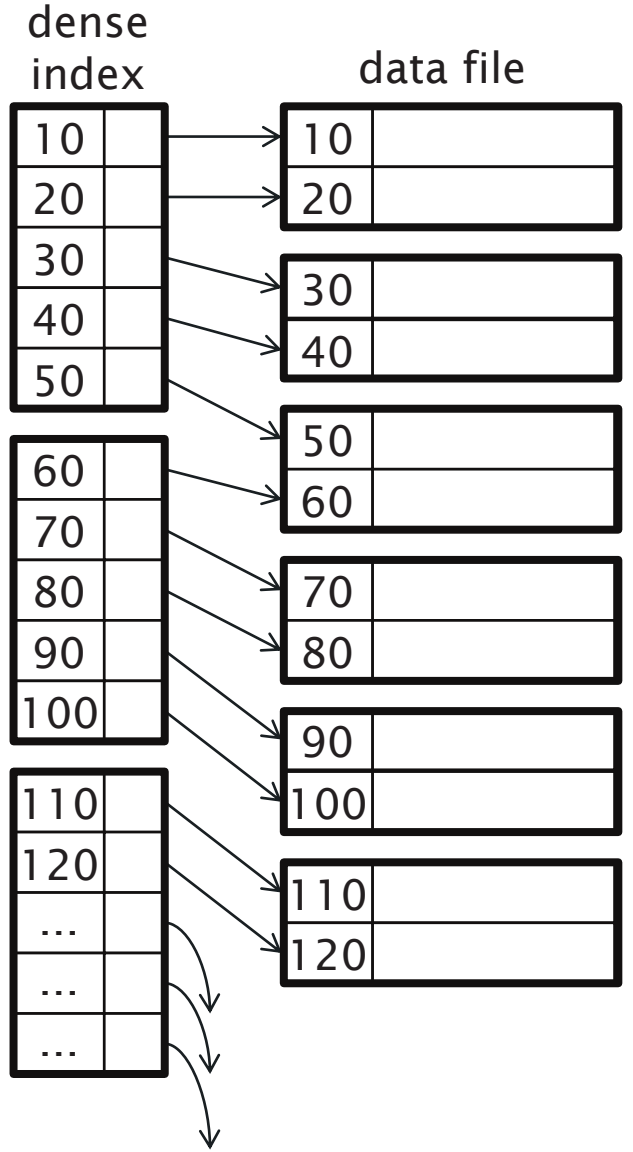
- When entries are added to the relation, index must be updated
- Index must be maintained to make good use of resources

There is a trade off between:

- Rapid access when retrieving data
- Speed of updating the database

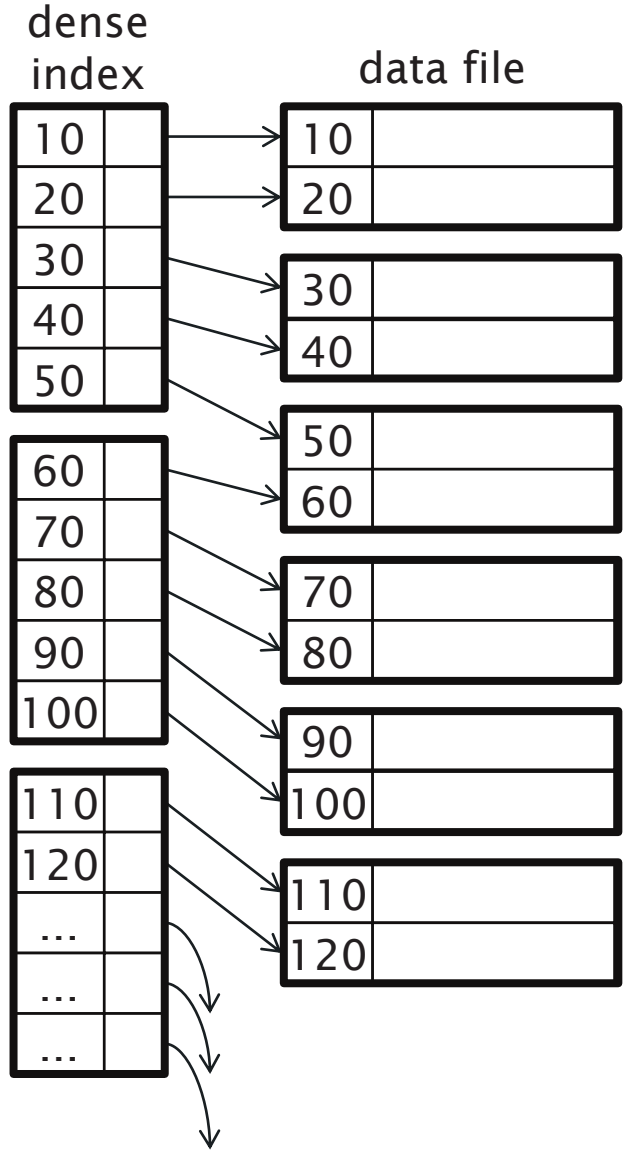
Dense Index

- Sequence of blocks holding only keys and pointers to records
- One key/pointer pair for every **record** in data file
- Blocks of index are in same order as those of the data file
- Key-pointer pair much smaller than record



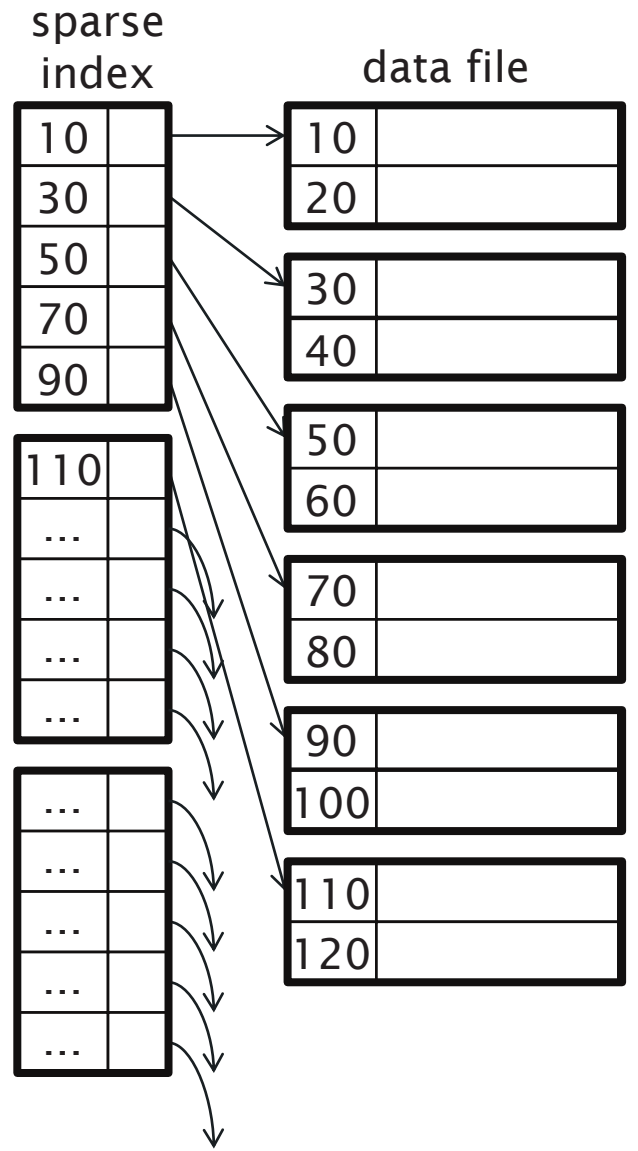
Dense Index

- Fewer blocks than data file, fewer disk accesses
- Keys are sorted, so can use binary search
- Can keep in main memory if small enough (no disk accesses)



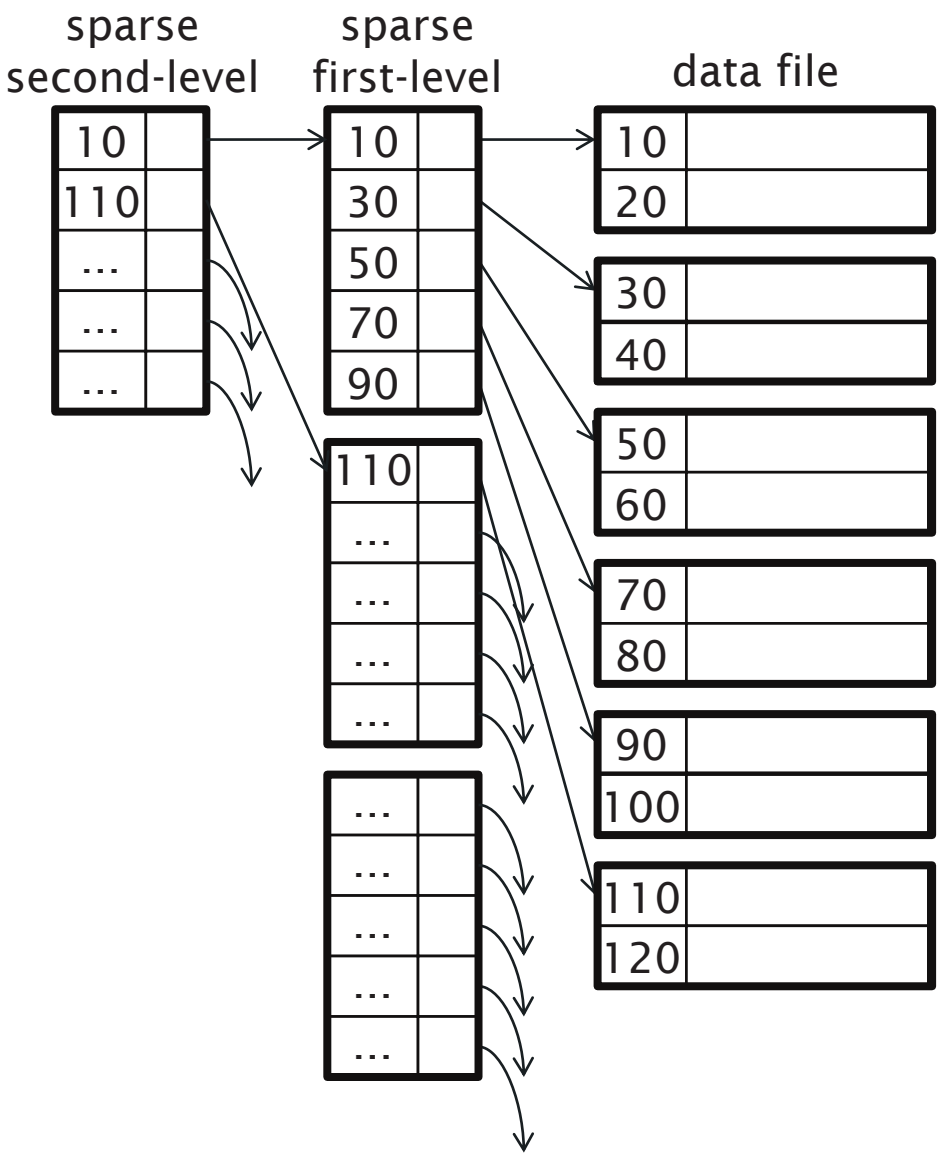
Sparse Index

- One key/pointer pair for every **block** in data file
- Can only be used if data file is sorted by search key
- Uses less space than dense index
- Potentially takes longer to find key than dense index (



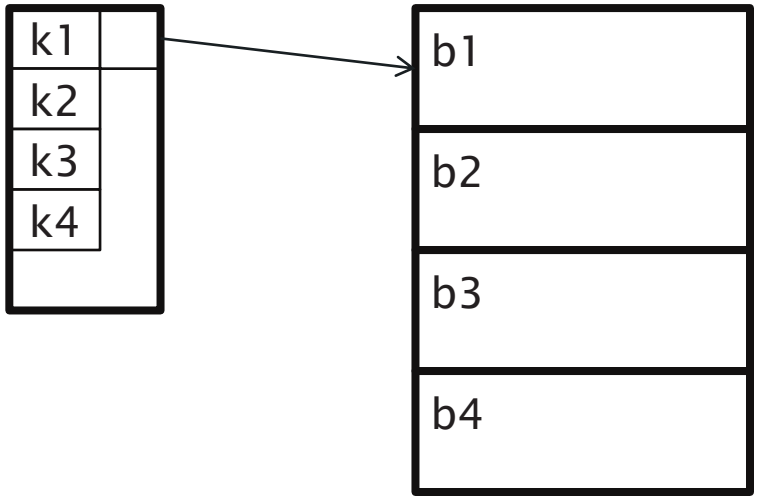
Multi-level Index

- Index file may cover many blocks
- May still need many disk accesses
- Use sparse index over the first index
  - Can't be a dense index (would use the same number of blocks as the index being indexed)
- Can create a third level index, but in general prefer B-trees



Notes on pointers:

- Block pointers (as used in sparse indexes) can be smaller than record pointers (used in dense indexes)
  - Physical record pointers consist of a block pointer and an offset
- If file is contiguous, then we can omit pointers
  - Compute offset from block size and key position
  - e.g. assuming 1kB per block and a pointer to block with key k1, to get block with key k3, use offset of (3-1)*1 = 2kB



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Sparse vs. Dense Tradeoff

Sparse:

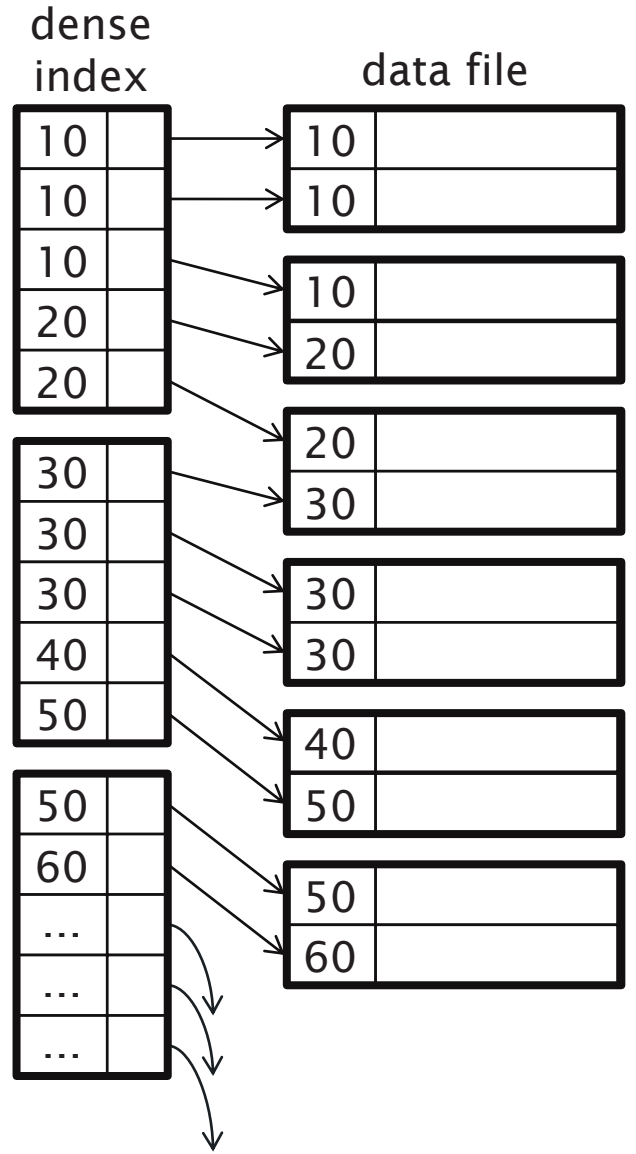
- Less index space per record can keep more of index in memory
- Better for insertions

Dense:

- Can tell if a record exists without accessing file
- Needed for secondary indexes

Duplicate Keys

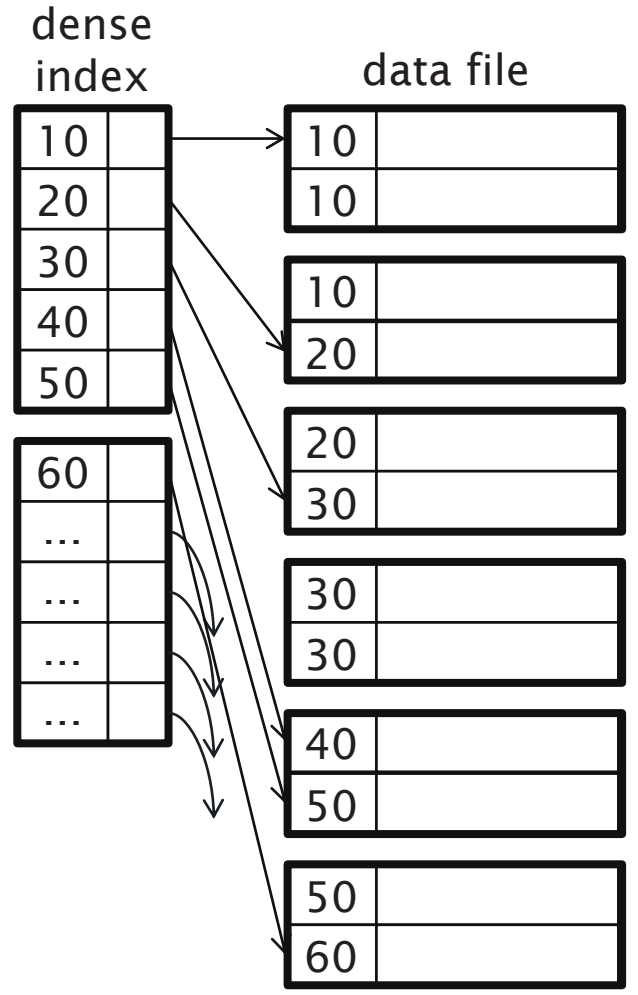
Dense index approach #1



Duplicate Keys

Dense index approach #2

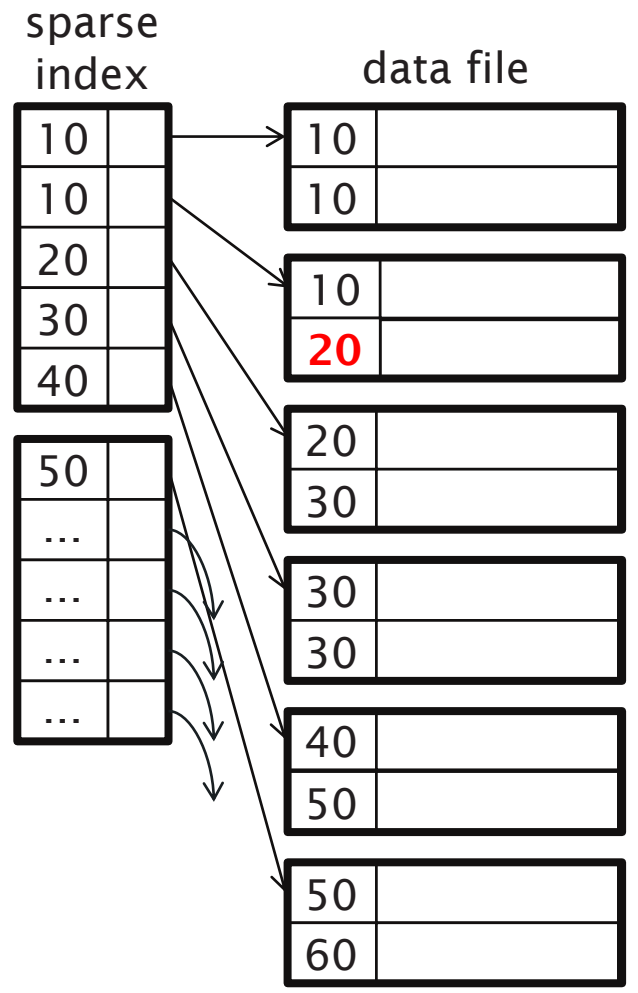
- Point at the first record with a given value
- better approach?
  (smaller index)



Duplicate Keys

Sparse index approach #1

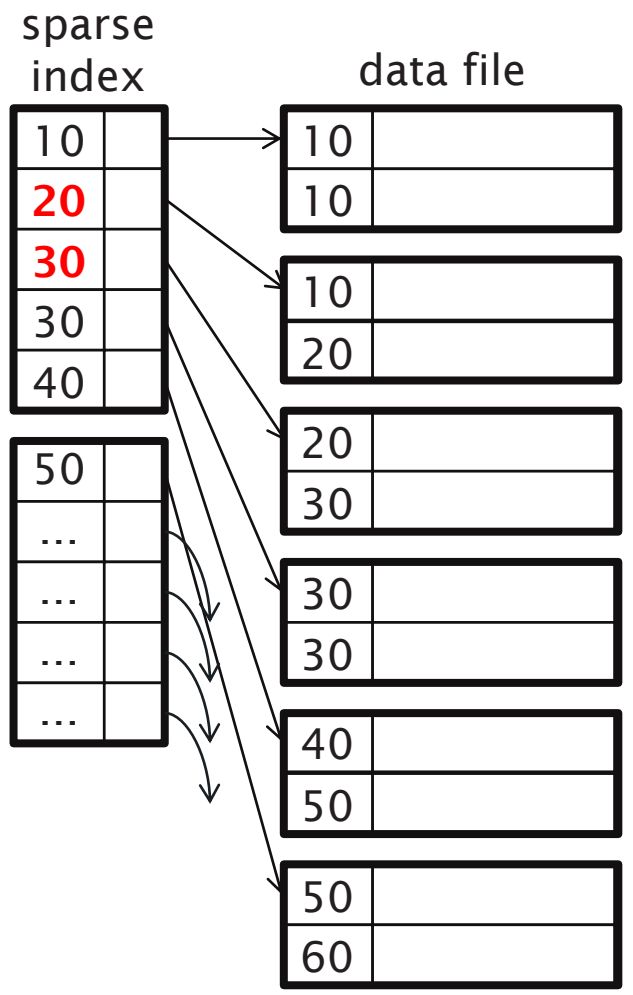
- Searching for (e.g.) 20 will give unexpected results



Duplicate Keys

Sparse index approach #2

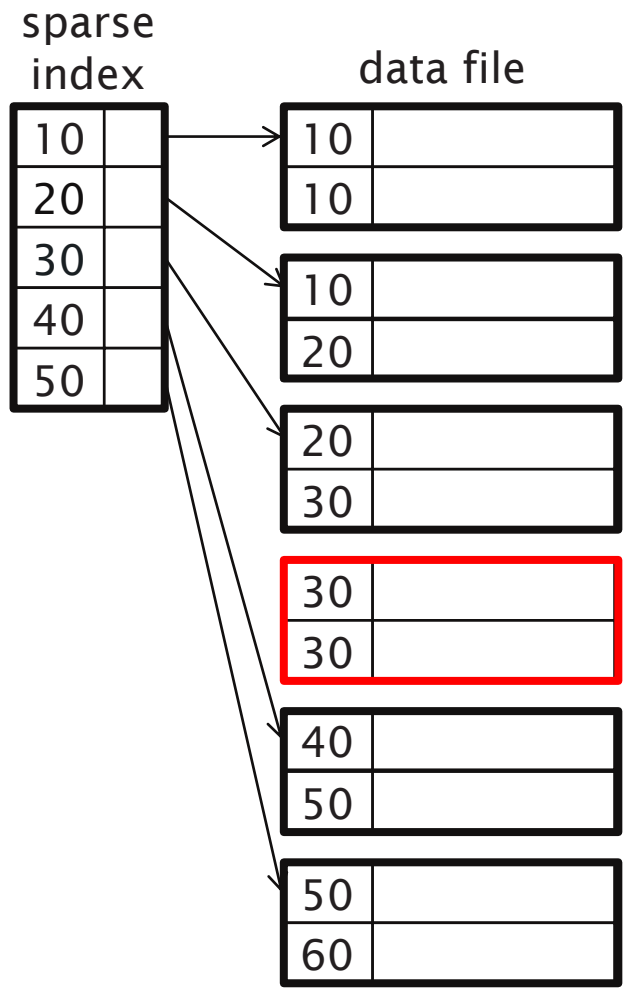
- Index contains first *new* key from each block



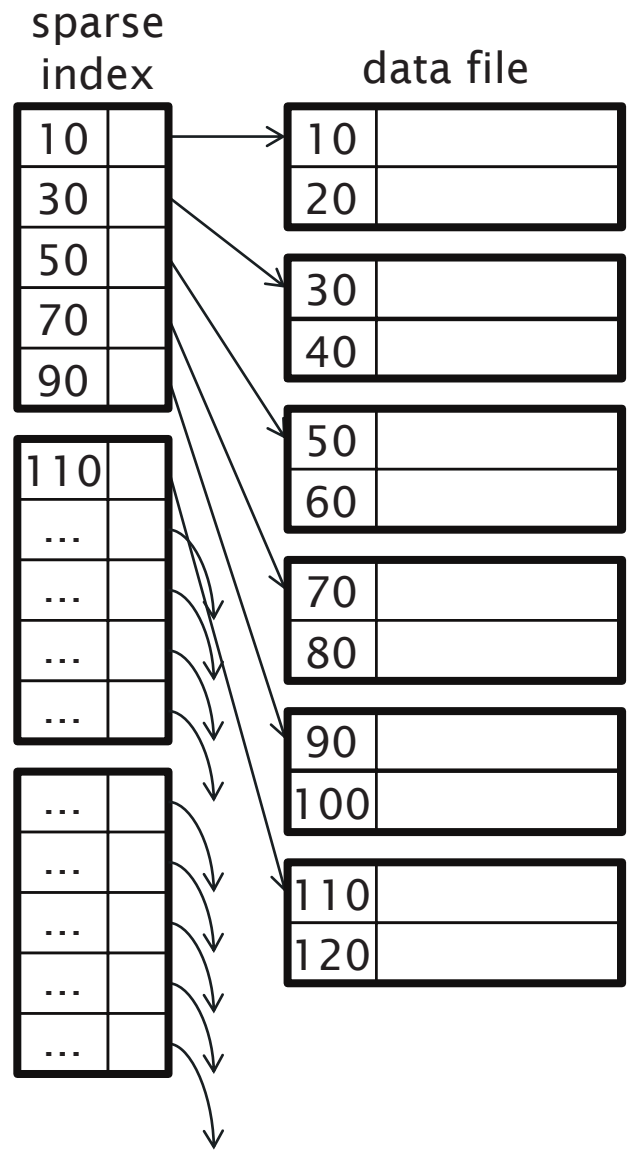
Duplicate Keys

Sparse index approach #2

- Can we exclude sequences of blocks with repeated keys?
- Point only to *first* instance of each value

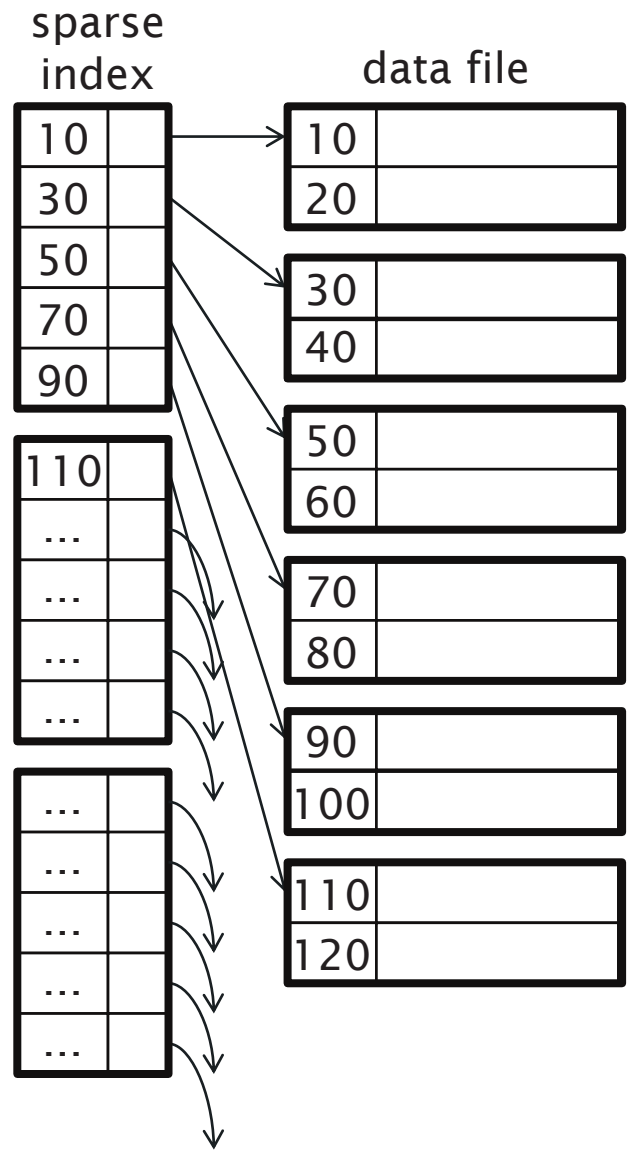


Deletion from Sparse Index



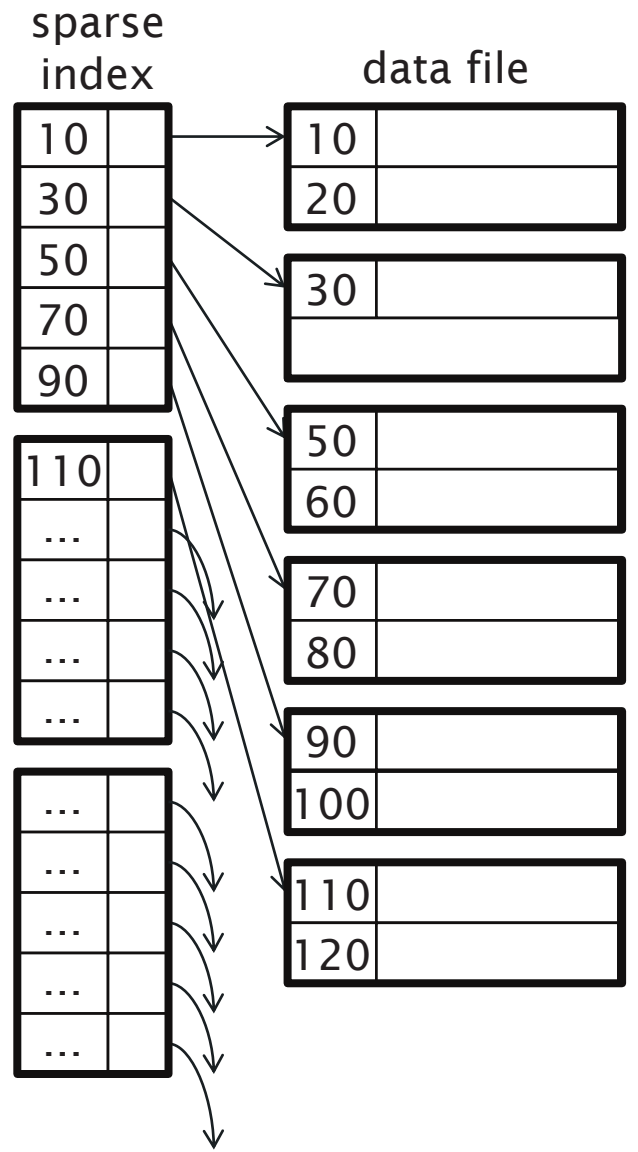
Deletion from Sparse Index

- Delete record 40



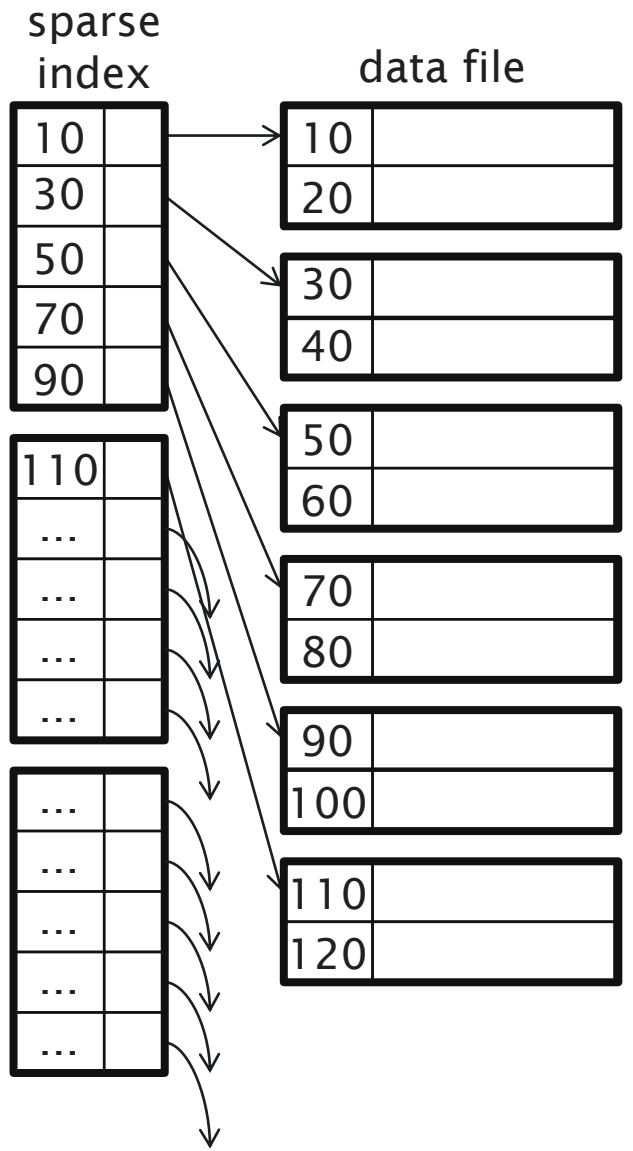
Deletion from Sparse Index

- Delete record 40



Deletion from Sparse Index

- Delete record 30
  - Delete record 30 from data file and reorder block
  - Update entry in index



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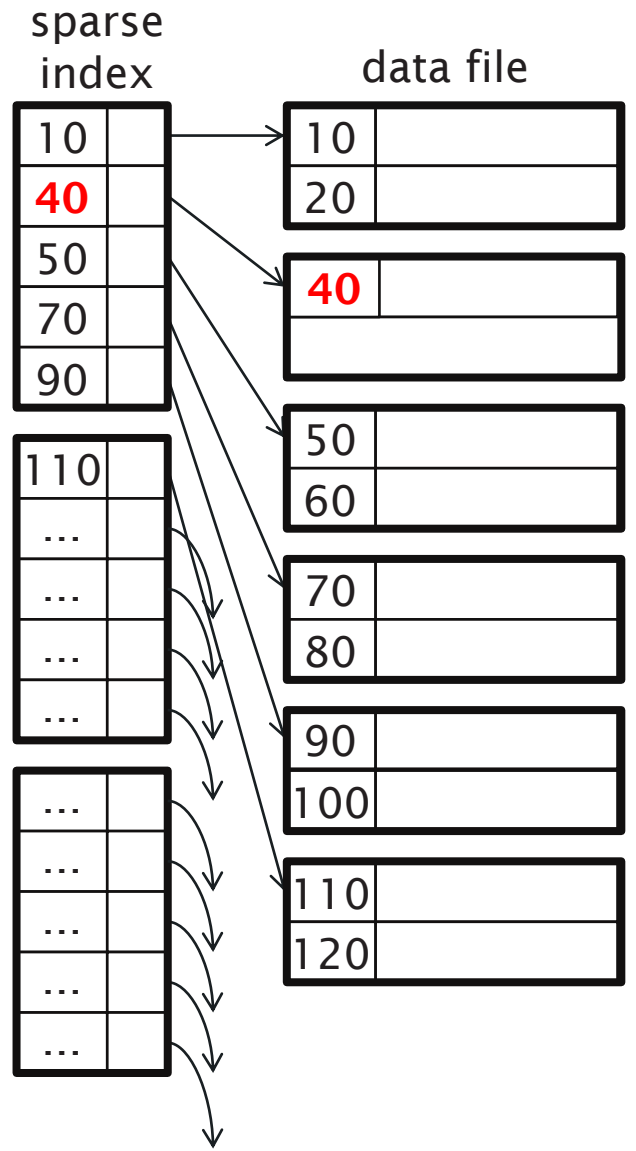
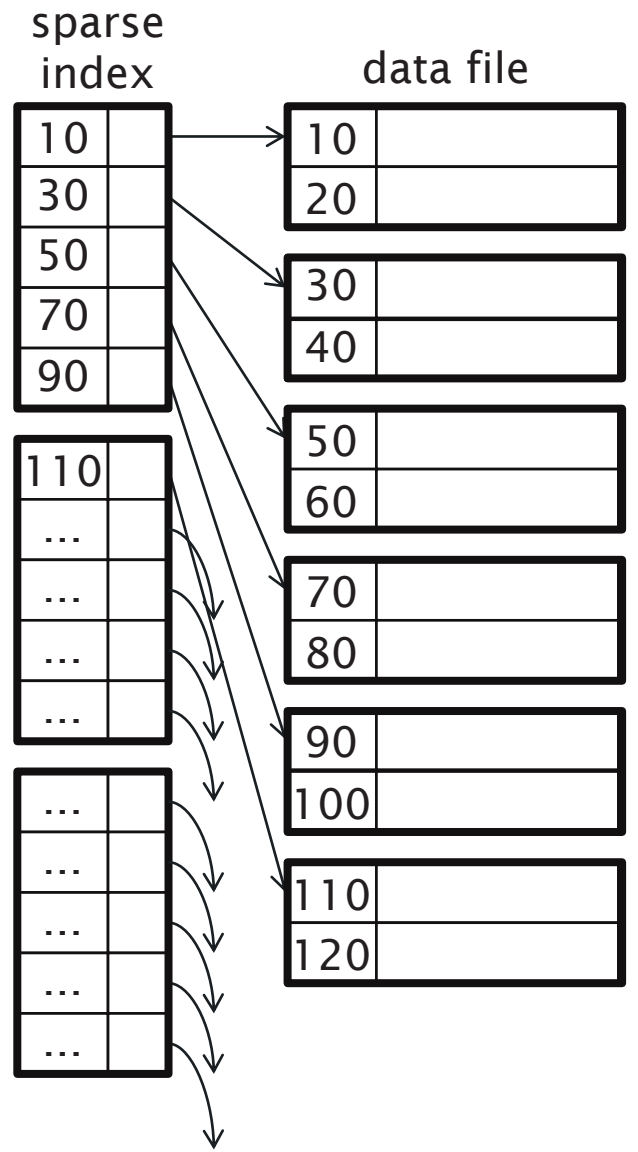


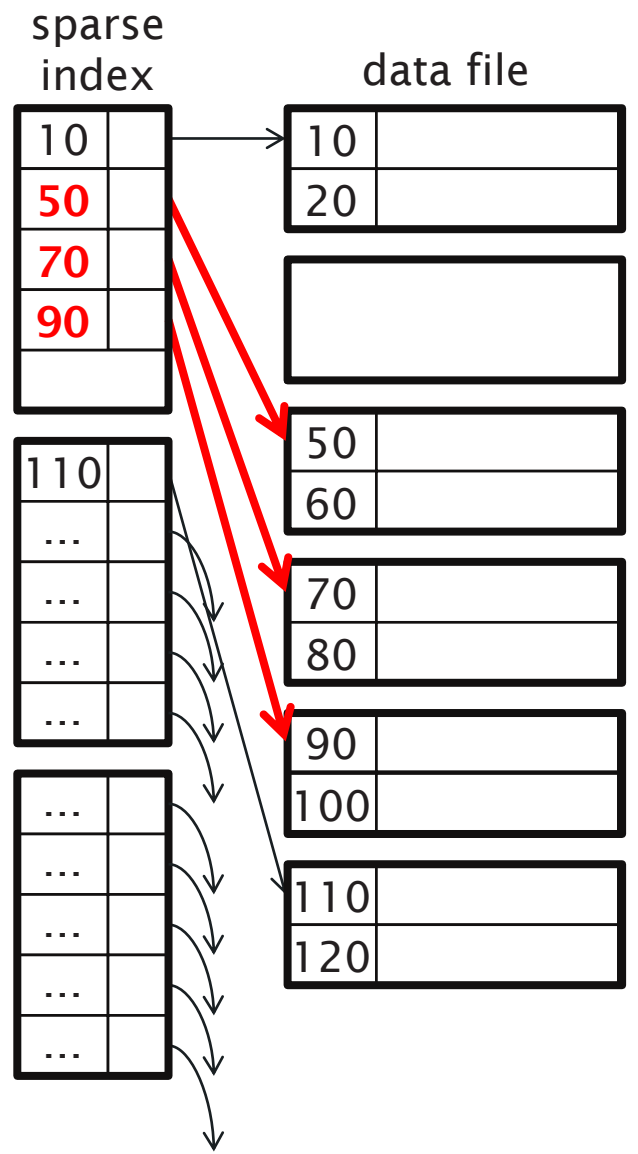
Deletion from Sparse Index

- Delete records 30 and 40
  - Delete records from data file
  - Update index



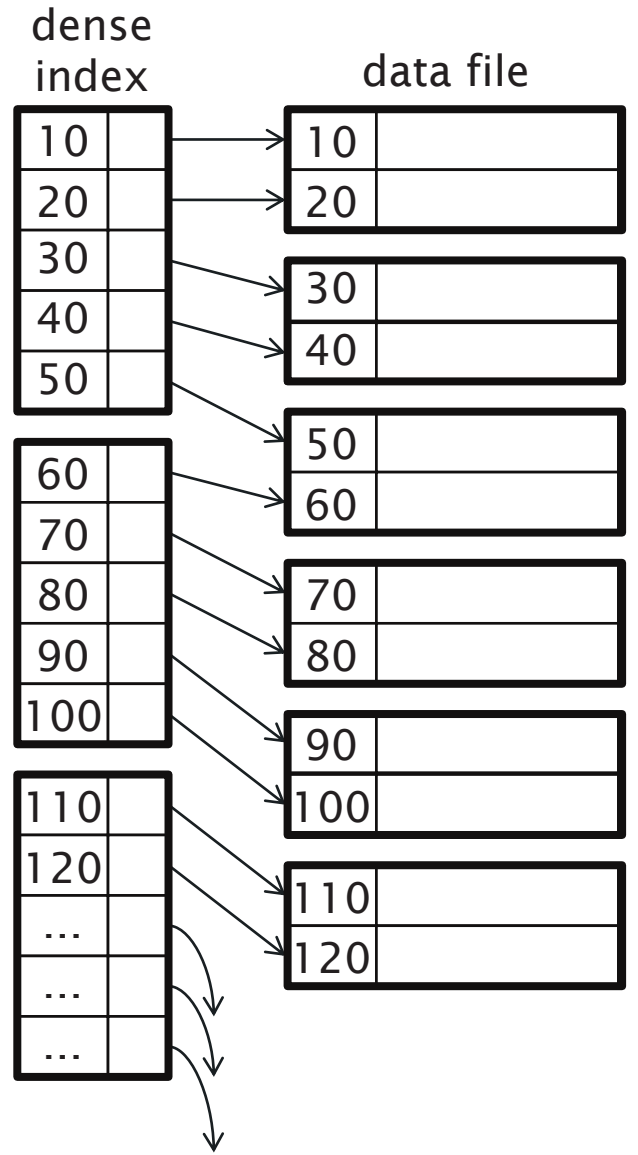
Deletion from Sparse Index

- Delete records 30 and 40
  - Delete records from data file
  - Update index



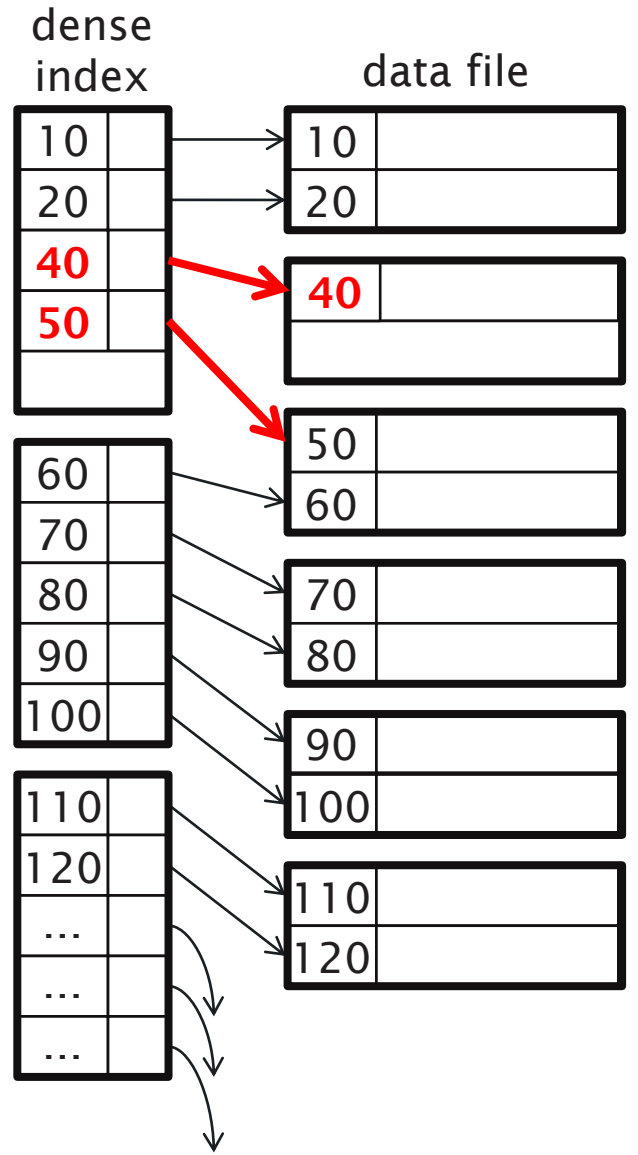
Deletion from Dense Index

- Delete record 30
  - Delete record from data file
  - Remove entry from index and update index

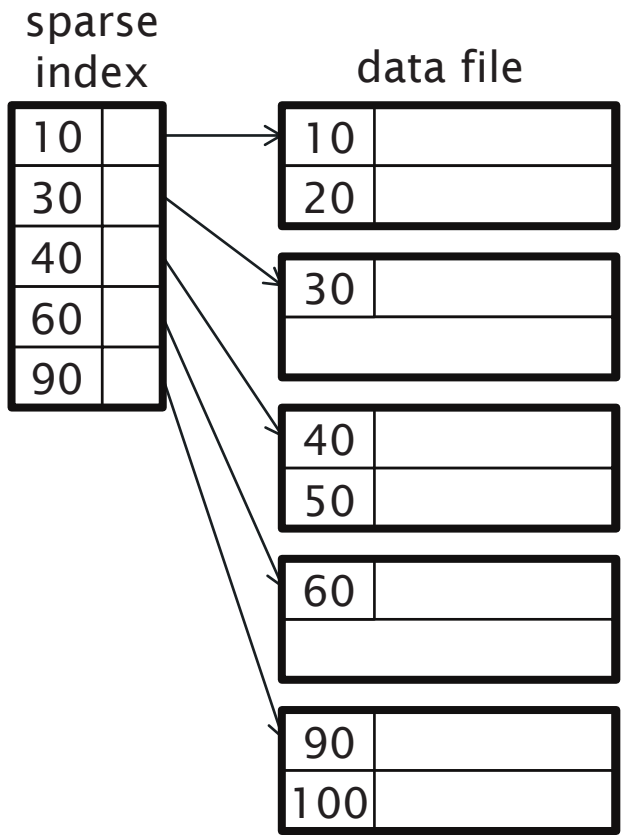


Deletion from Dense Index

- Delete record 30
  - Delete record from data file
  - Remove entry from index and update index

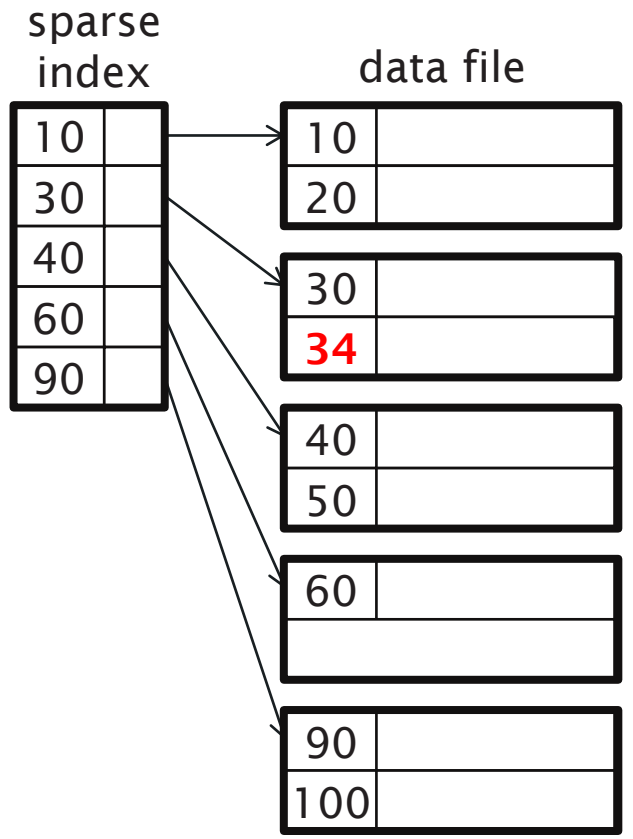


Insertion into Sparse Index



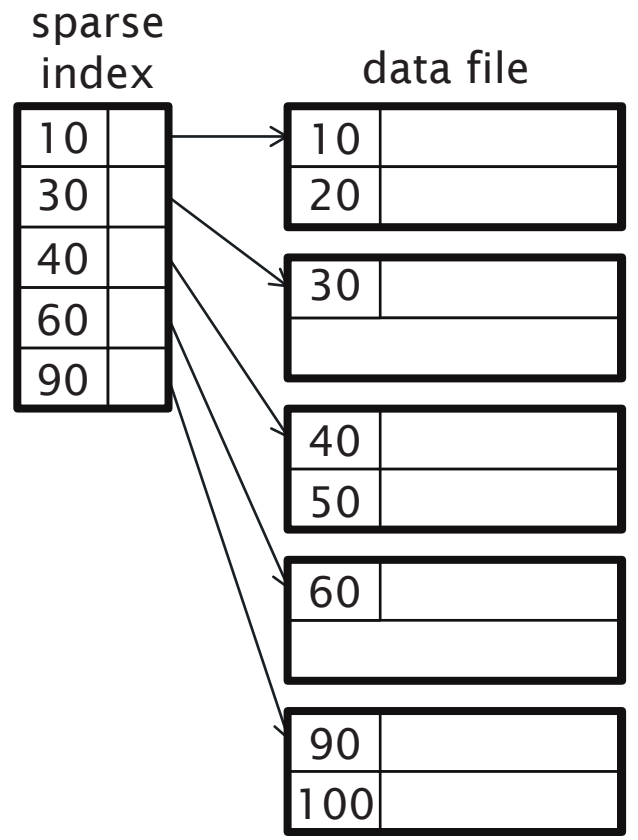
Insertion into Sparse Index

- Insert record 34
  - Easy! We have free space in the right block of the data file



Insertion into Sparse Index

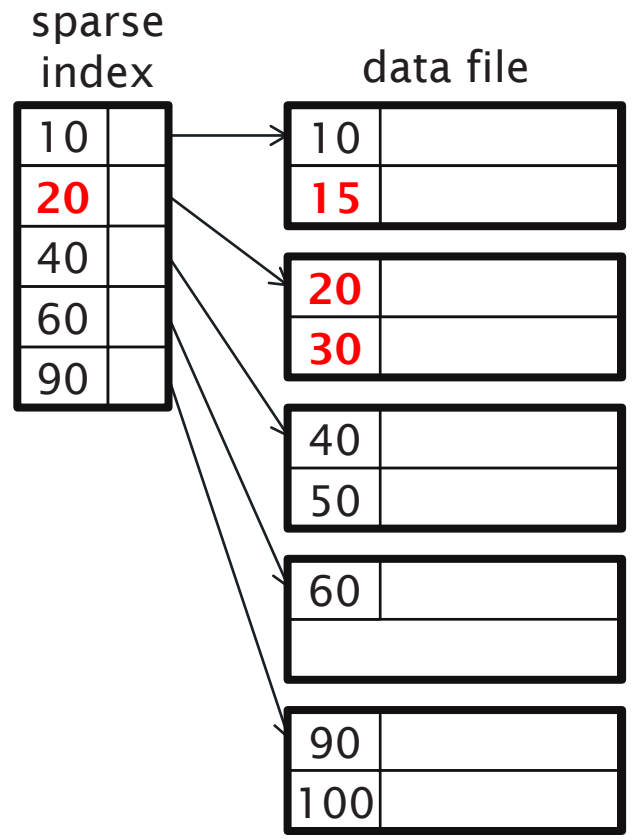
- Insert record 15
  - Add to data file and immediately reorganise
  - Update index



Insertion into Sparse Index

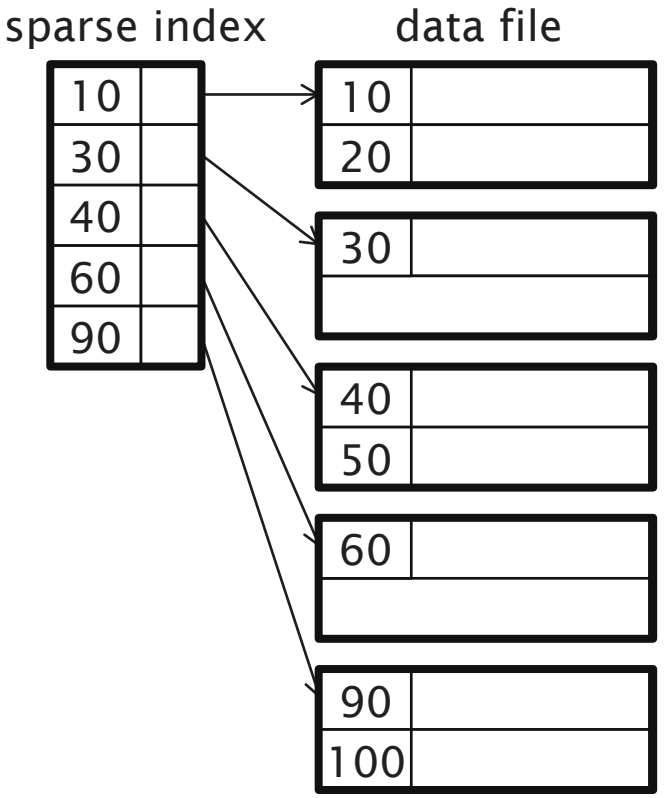
- Insert record 15
  - Add to data file and immediately reorganise
  - Update index

- Alternatively:
  - Insert new block (chained file)
  - Update index



Insertion into Sparse Index

- Insert record 25
  - Block is full, so add to overflow block
  - Reorganise later…



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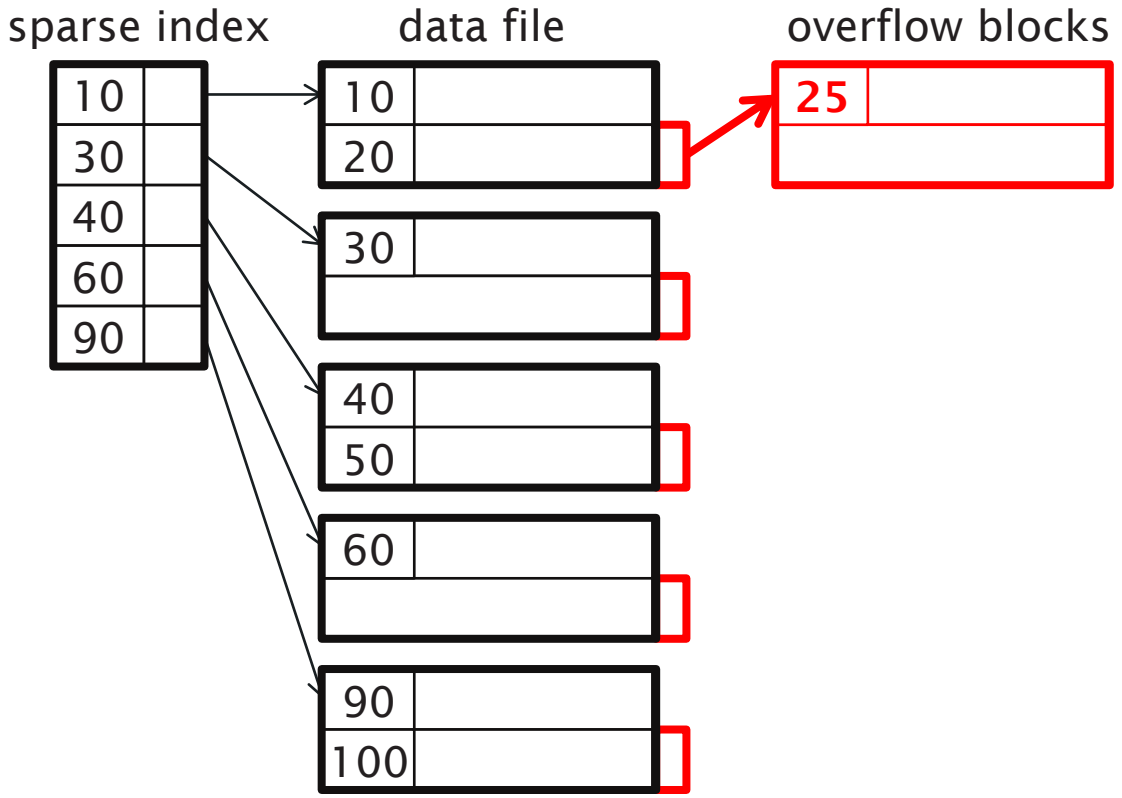
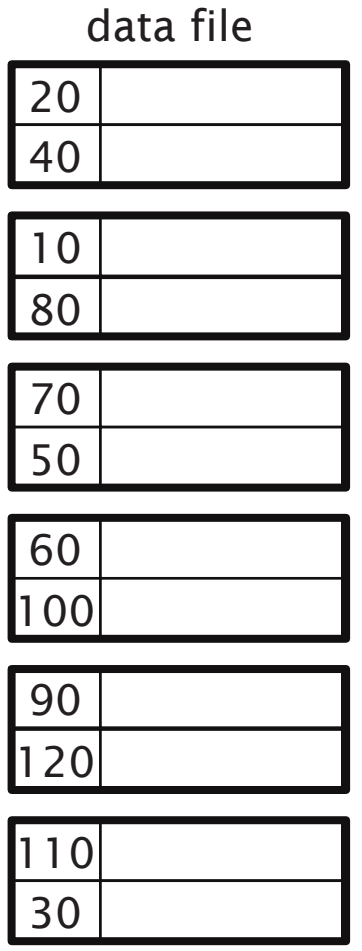


Secondary Indexes

- Unlike a primary index, does not determine placement of records in data file
- Location (order) of records may have been decided by a primary index on another field
- Secondary indexes are always dense
- Pointers are record pointers, not block pointers



Secondary Indexes

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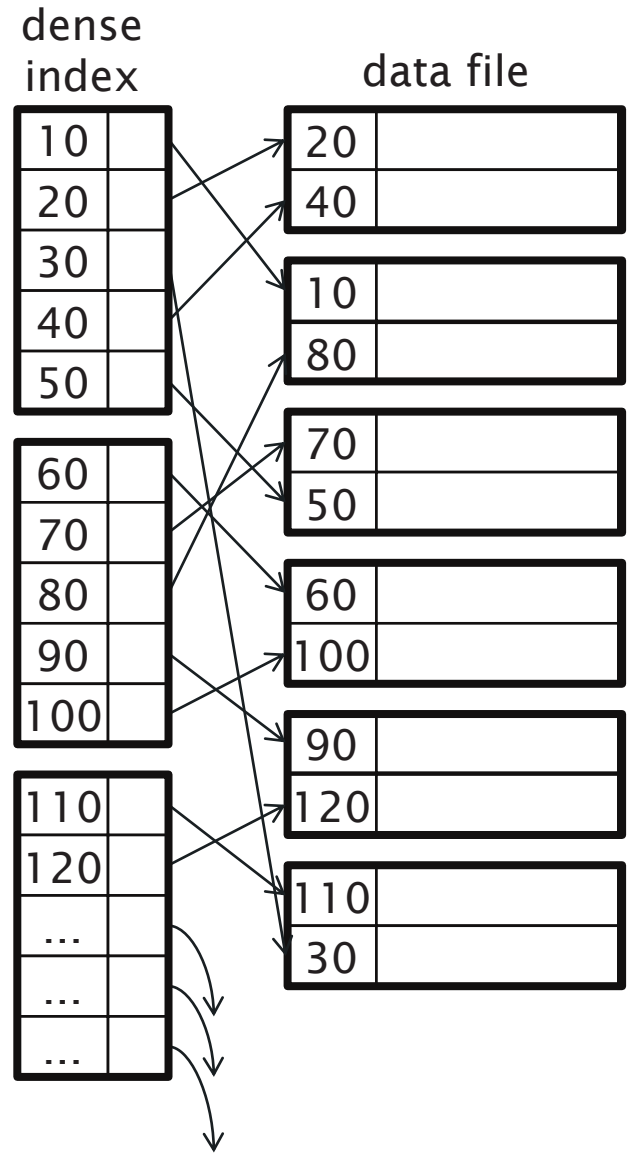
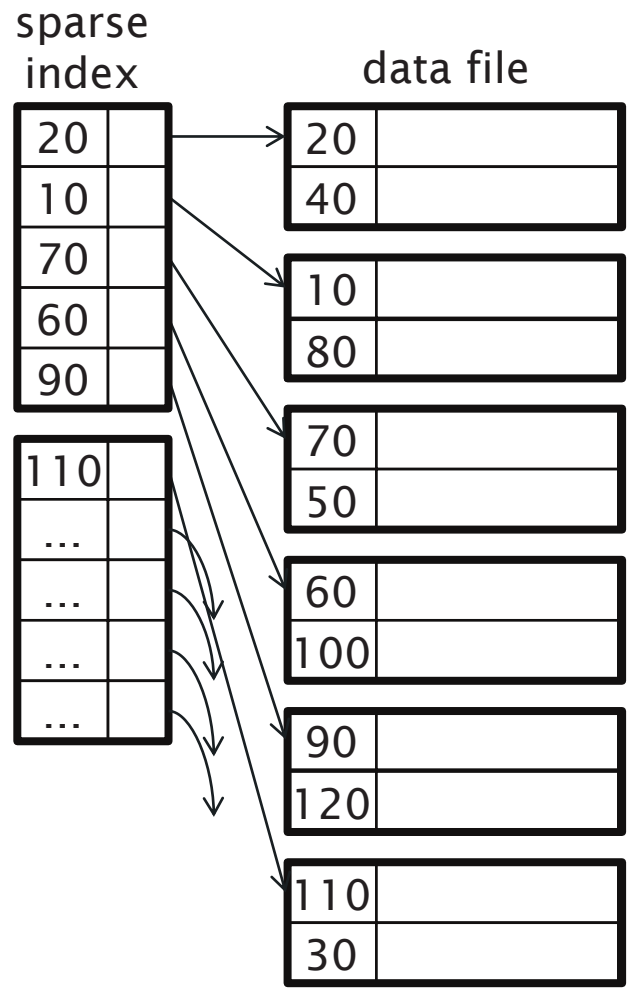


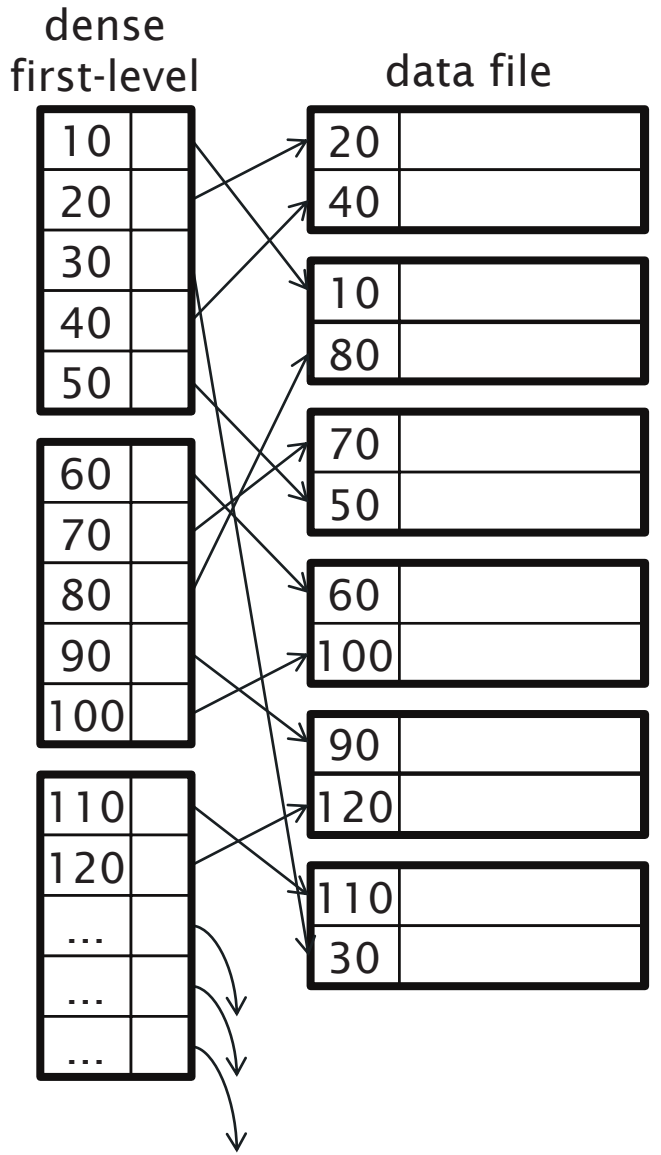
Secondary Indexes

- Sparse secondary indexes make no sense



Secondary Indexes

- May have higher levels of sparse indexes above the dense index



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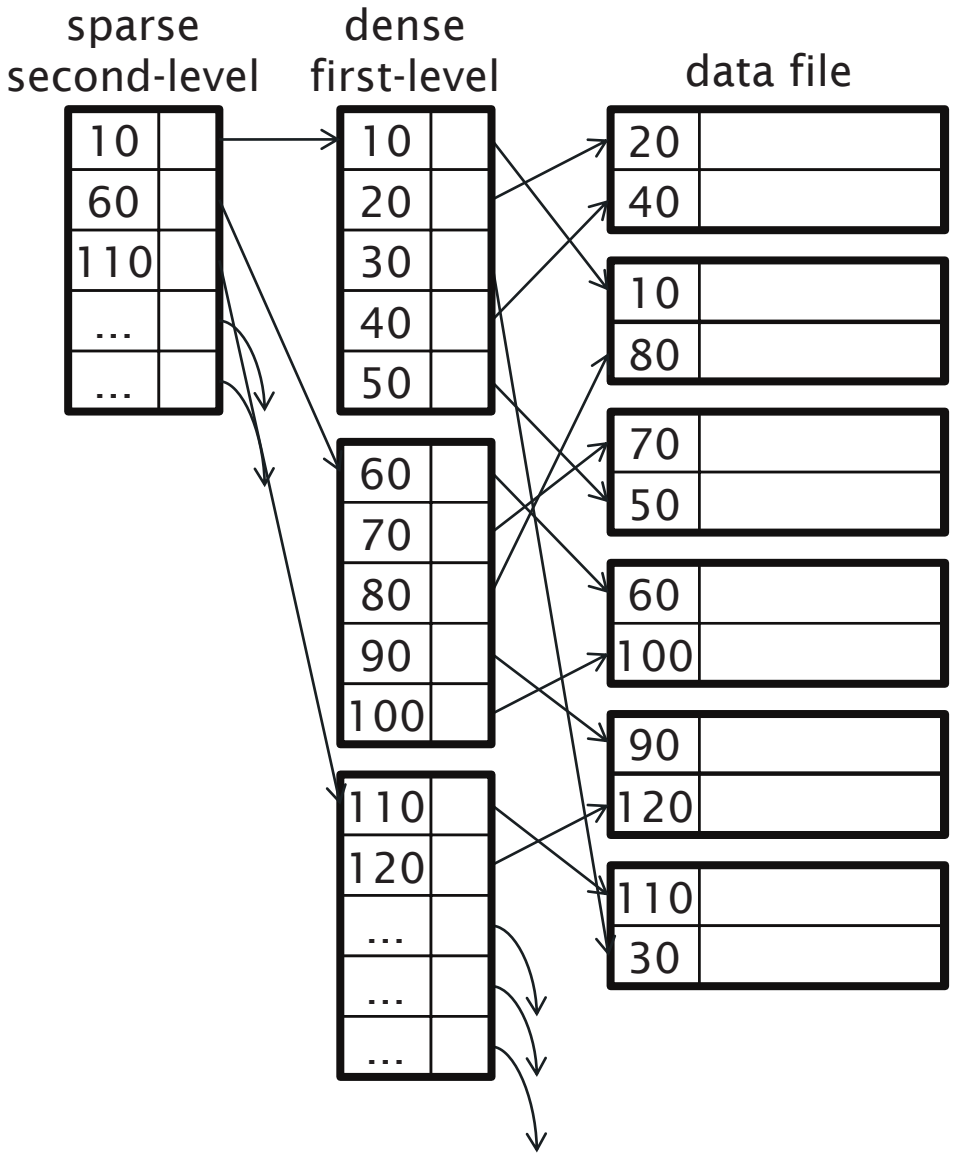
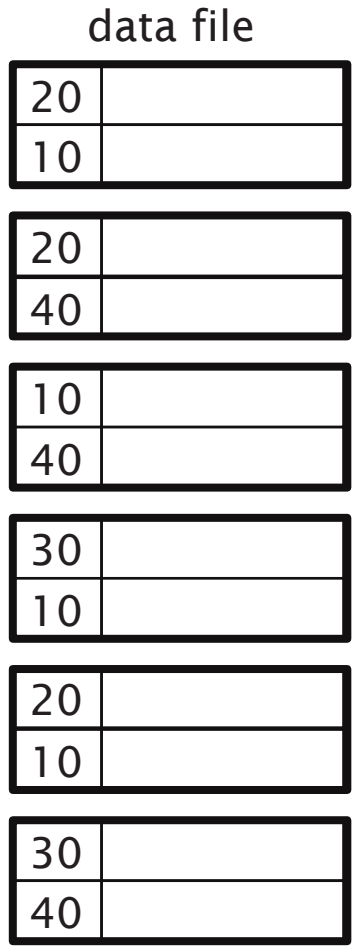


Duplicate values

- Secondary indexes need to cope with duplicate values in the data file

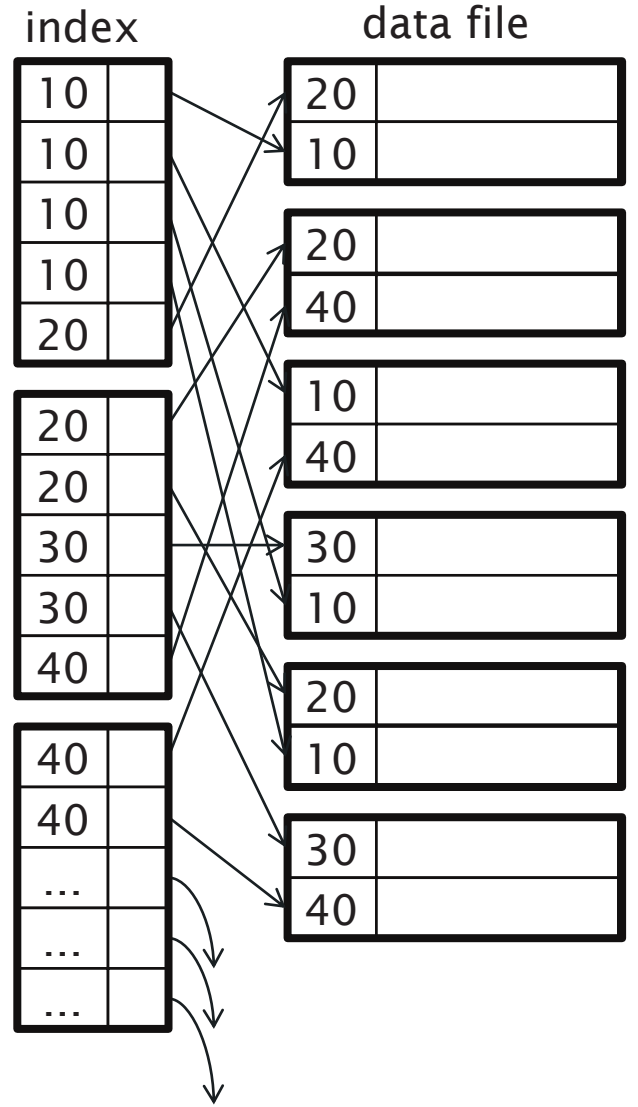


Duplicate values

Solution #1: repeated entries

Problems

- excess disk space
- excess search time

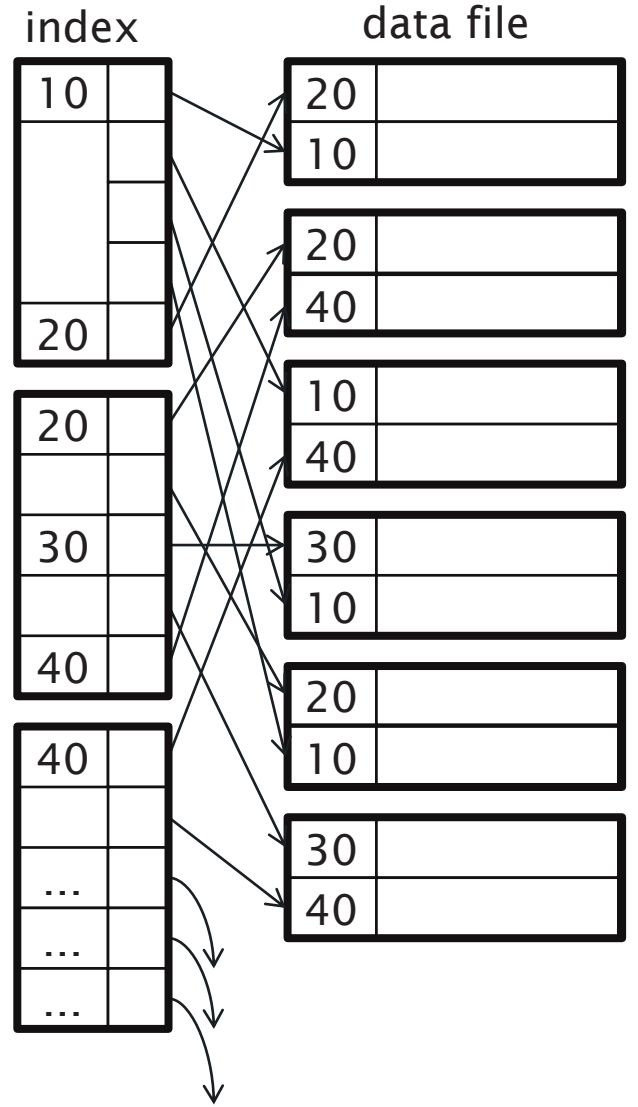


Duplicate values

Solution #2: drop repeated keys

Problems

- variable size records in index

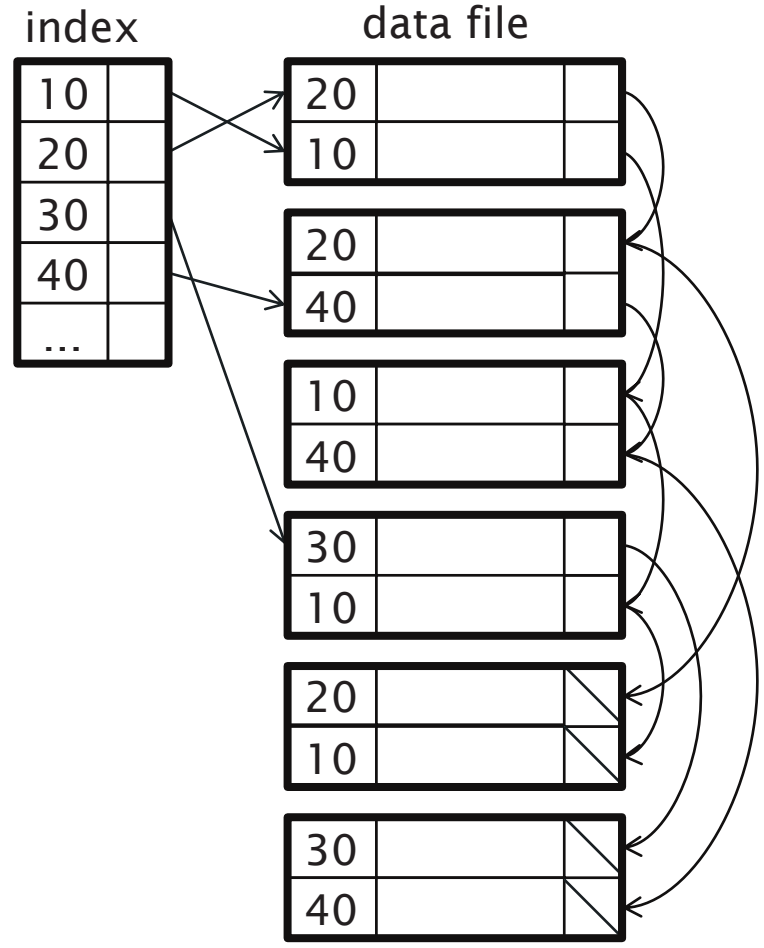


Duplicate values

Solution #3: chain records with same key

Problems

- need to add fields to records
- need to follow chain

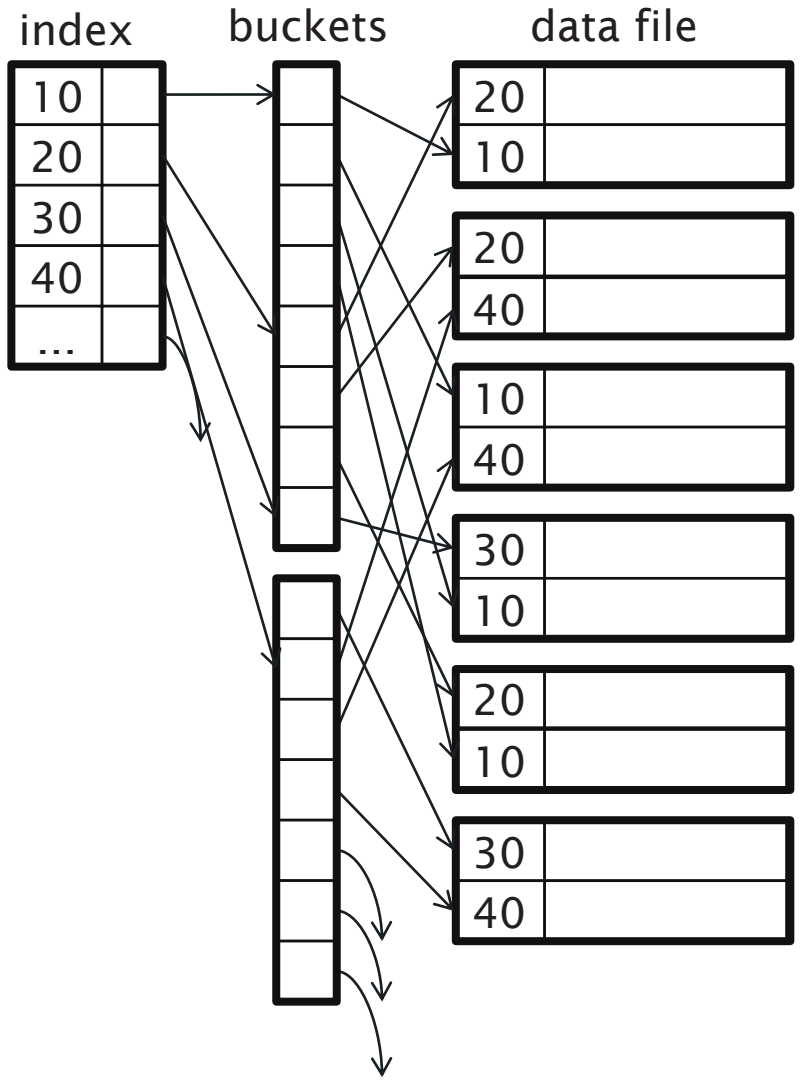


Duplicate values

Solution #4: indirection via buckets of pointers

Advantages

- If we have multiple secondary indexes on a relation, we can calculate conjunctions by taking intersections of buckets
- Don't need to examine data file!



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Conventional indexes

Advantages:

- Simple
- Index is sequential file and good for scans

Disadvantages:

- Inserts expensive, and/or
- Lose sequentiality & balance

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B+trees

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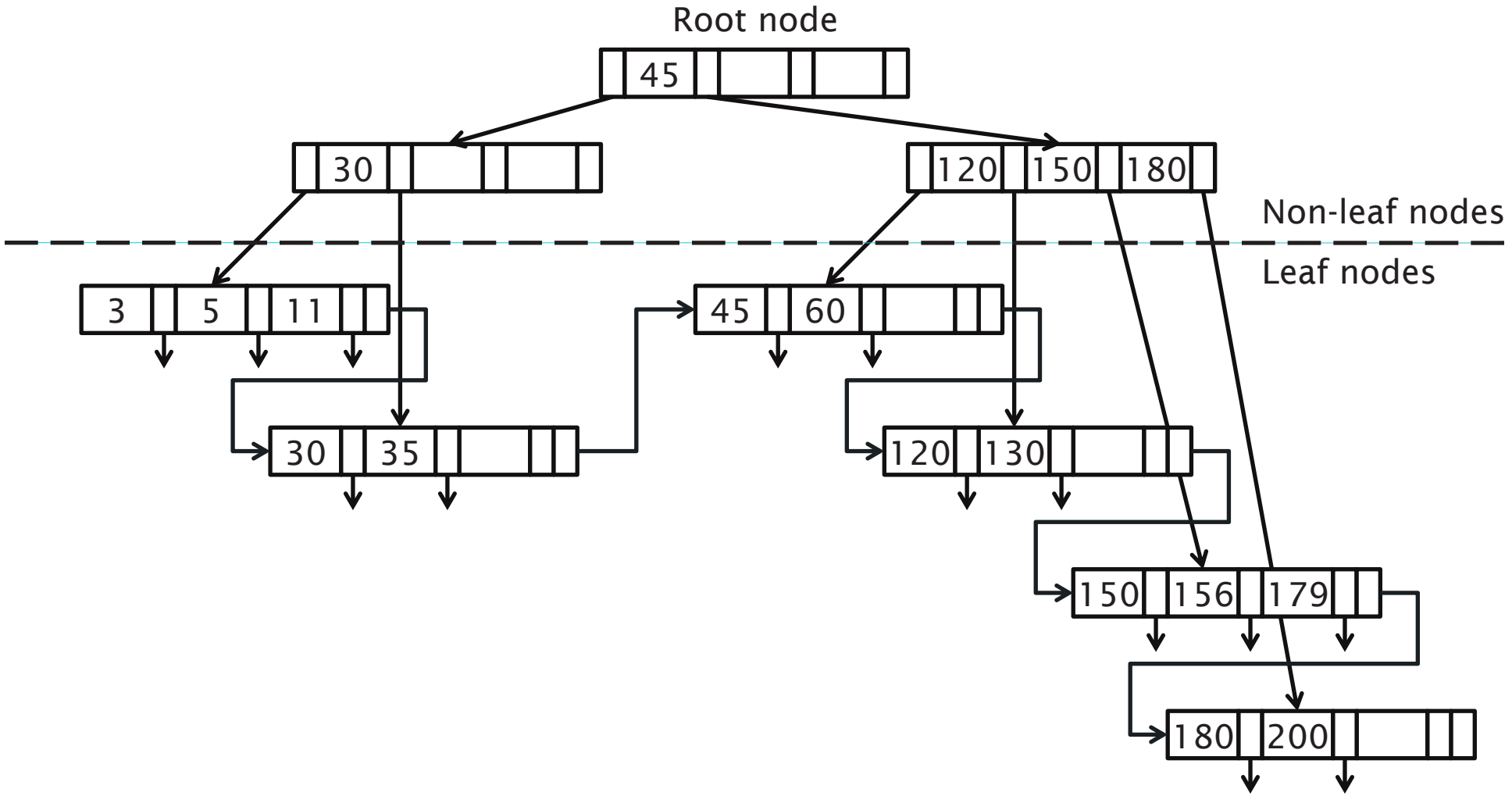
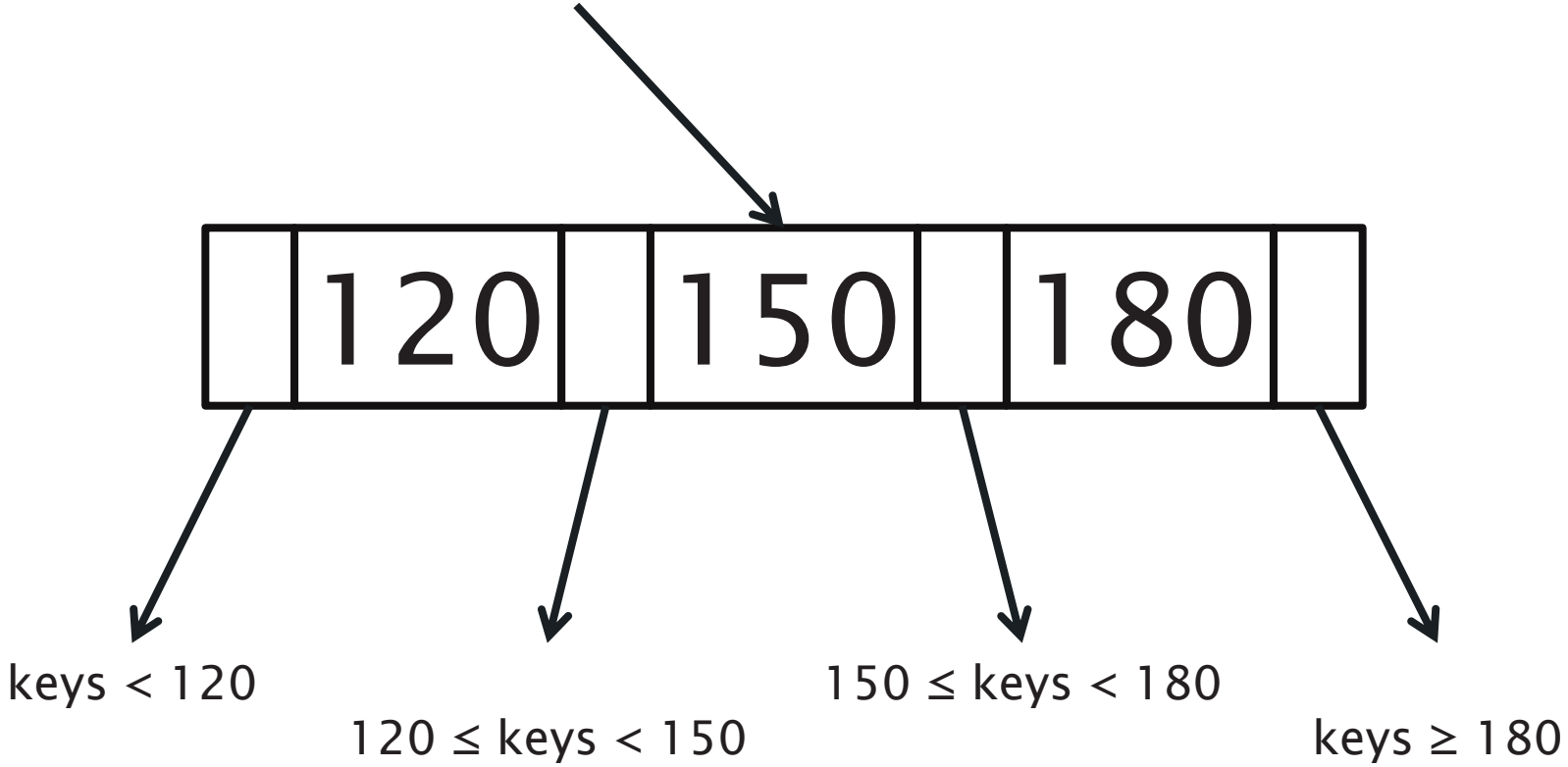
B+trees

- The most widely used tree-structured indexes
- Balanced multi-way tree
  - Yields consistent performance
  - Sacrifices sequentiality

B+tree example



Example non-leaf node



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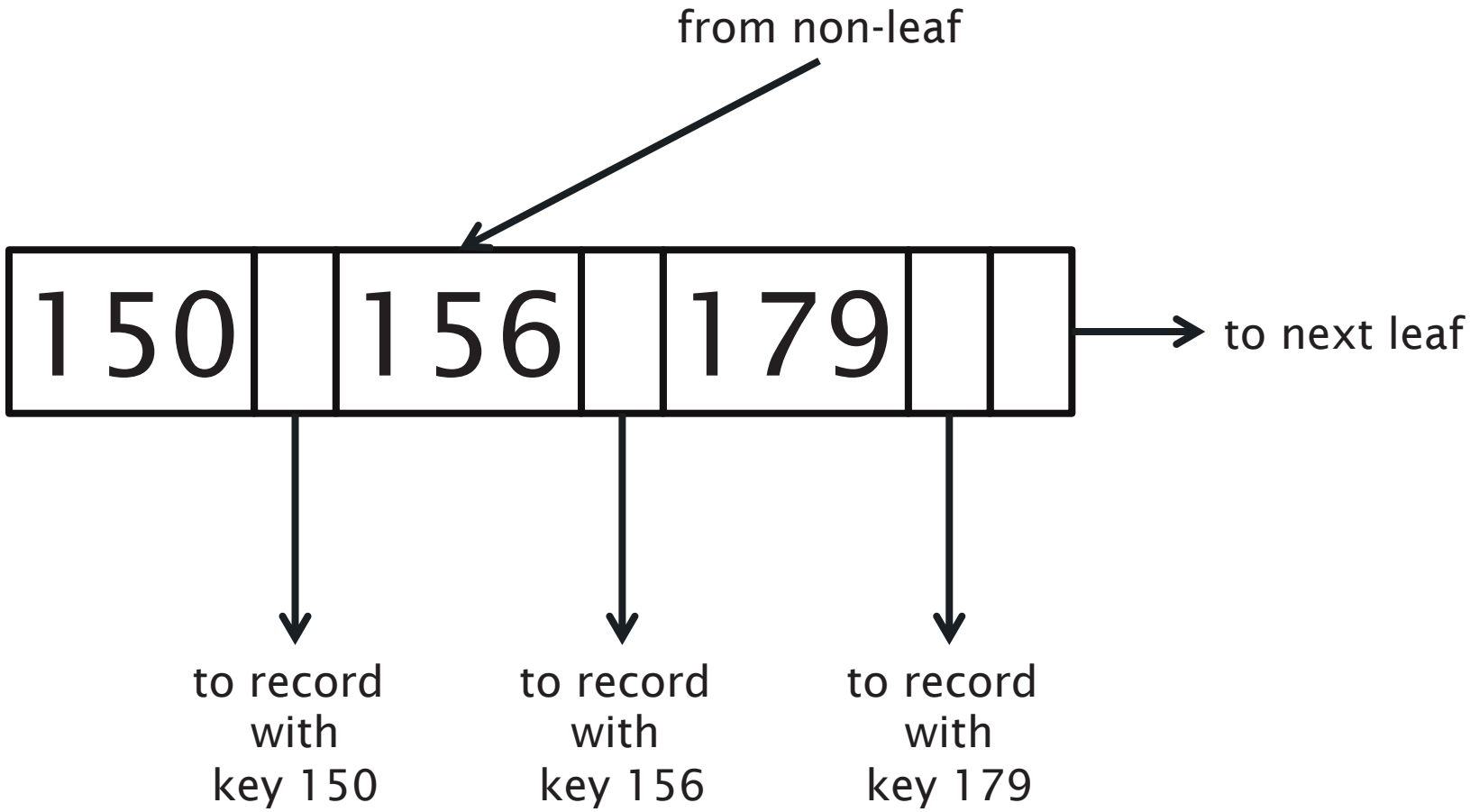
Non-leaf nodes

Root node typically kept in memory

- Entrance point to index – used as frequently as any other node
- Some nodes from second level may also be kept in memory

Example leaf node



Leaf nodes

If the index is a primary index

- Leaf nodes are records containing data, stored in the order of the primary key
- The index provides an alternative to a sequential scan

If the index is a secondary index

- Leaf nodes contain pointers to the data records
- Data can be accessed in the sequence of the secondary key
- A secondary index can point to any sort of data file, for example one created by hashing

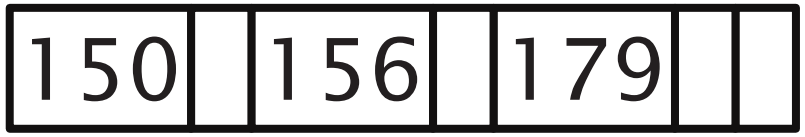
Node size

Each node is of fixed size and contains

- n keys
- n+1 pointers

non-leaf

leaf



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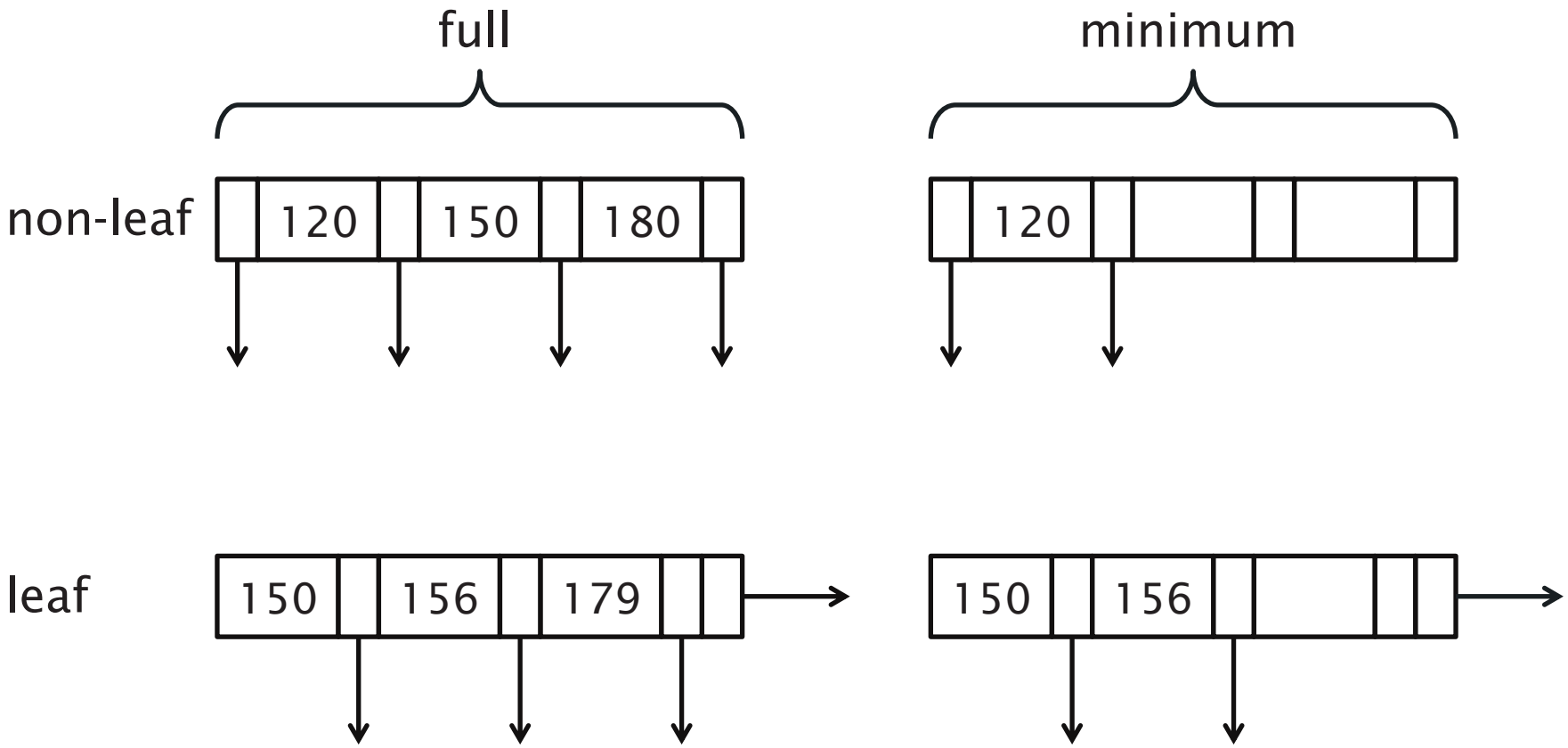
Minimum nodes

Don’t want nodes to be too empty (efficient use of space)

Non-leaf: $\lceil (n+1)/2 \rceil$ pointers

Leaf: $\lfloor (n+1)/2 \rfloor$ pointers

Minimum node examples (n=3)



B+tree rules

1. All leaves same distance from root (balanced tree)
2. Pointers in leaves point to records except for “sequence pointer”
3. Number of pointers/keys for B+tree of order n:

	max ptrs	max keys	min ptrs to data	min keys
Non-leaf	n+1	n	$\lceil (n+1)/2 \rceil$	$\lceil (n+1)/2 \rceil - 1$
Leaf	n+1	n	$\lfloor (n+1)/2 \rfloor$	$\lfloor (n+1)/2 \rfloor$
Root	n+1	n	1	1

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B+tree arithmetic example

First, some parameters:

- block size 4kb, of which:
  b = 4000 bytes available for storage of records
- key length
  k = 10 bytes
- record length
  r = 100 bytes (including the key)
- block pointer
  p = 6 bytes

B+tree arithmetic example

A leaf node in a primary index can accommodate lp records, where lp = $\lfloor (b-p)/r \rfloor$ = 39 records

A leaf node in a secondary index can accommodate ls records,
where ls = $\lfloor (b-p)/(k+p) \rfloor$ = 249 records

A non-leaf node could accommodate i entries, where
i = $\lfloor (b-p)/(k+p) \rfloor$ = 249 records

To allow for expansion, assume initial node occupancy of u, where u = 0.6

B+tree primary index

For a primary index (the leaf nodes hold the records):

- A non-leaf node initially points to
  $i*u$ = blocks
- Each leaf initially contains
  $lp*u$ = records
- 1 level of non-leaf nodes initially points to
  $(lp*u)(i*u)$ = records
- 2 levels of non-leaf nodes initially point to
  $(i*u)^2$ = blocks
  $(lp*u)(i*u)^2$ = records

B+tree primary index

For a primary index (the leaf nodes hold the records):

- A non-leaf node initially points to
  $i*u$ = 149 blocks
- Each leaf initially contains
  $lp*u$ = 23 records
- 1 level of non-leaf nodes initially points to
  $(lp*u)(i*u)$ = 3,427 records
- 2 levels of non-leaf nodes initially point to
  $(i*u)^2$ = 22,201 blocks
  $(lp*u)(i*u)^2$ = 510,623 records

B+tree secondary index

For a secondary index (the leaf nodes hold record pointers):

- A non-leaf node initially points to
  $i*u$ = blocks
- A leaf node initially points at
  $ls*u$ = records
- 1 level of non-leaf nodes initially points to
  $(ls*u)(i*u)$ = records
- 2 levels of non-leaf nodes initially point to
  $(ls*u)(i*u)^2$ = records

B+tree secondary index

For a secondary index (the leaf nodes hold record pointers):

- A non-leaf node initially points to
  i*u = 149 blocks
- A leaf node initially points at
  ls*u = 149 records
- 1 level of non-leaf nodes initially points to
  (ls*u)(i*u) = 22,201 records
- 2 levels of non-leaf nodes initially point to
  $(ls*u)(i*u)^2$ = 3,307,949 records

It is not normally necessary to go more than about three levels deep in the index

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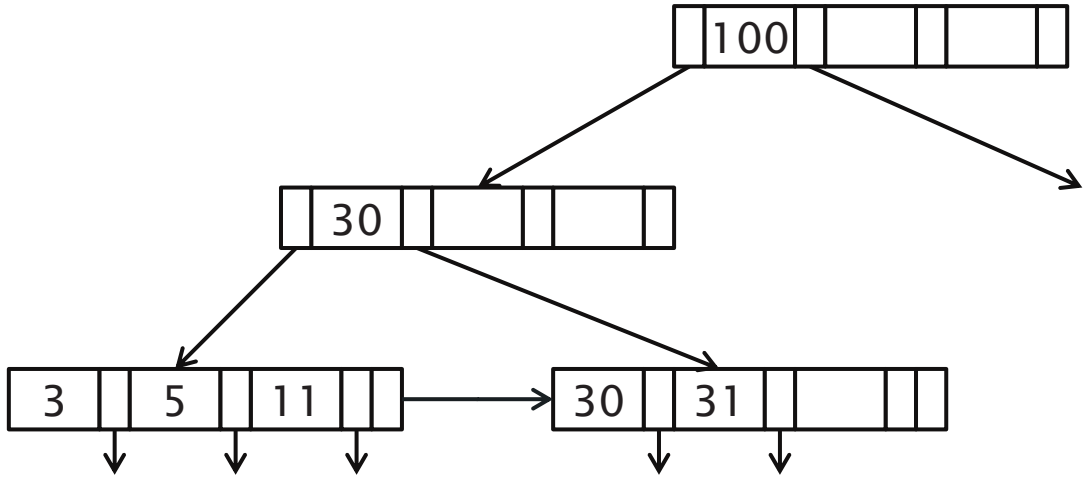
B+tree Insertion

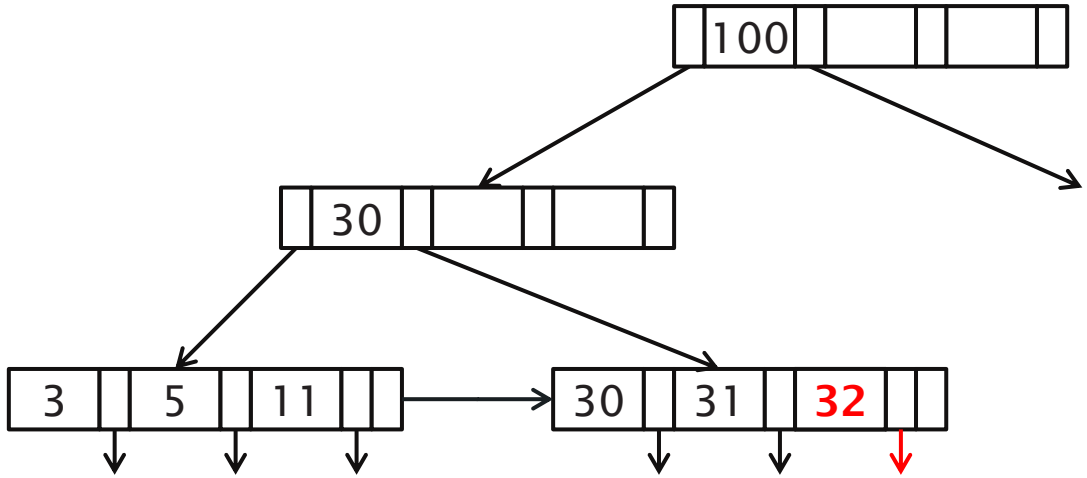
Four cases to consider:

1. Space available in leaf
2. Leaf overflow
3. Non-leaf overflow
4. New root

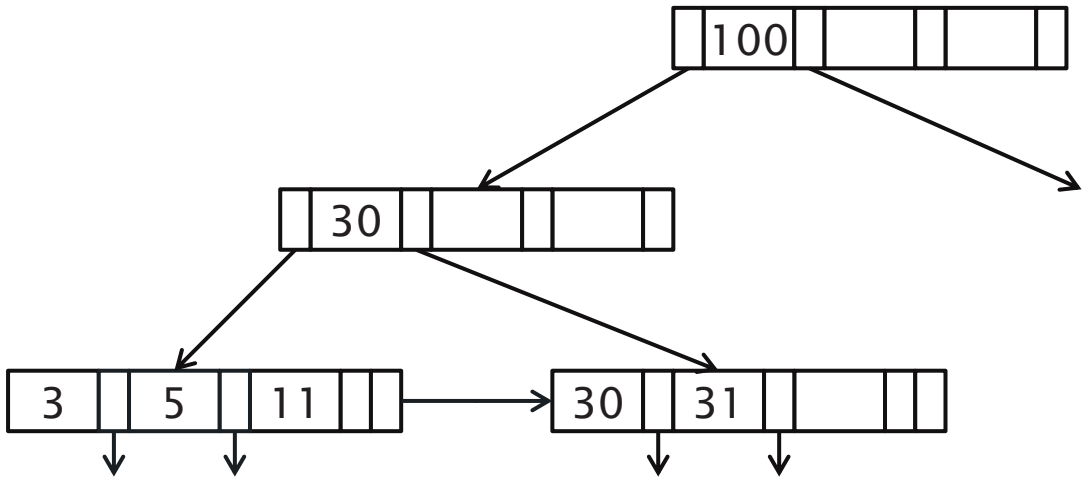
Case 1: insert key=32



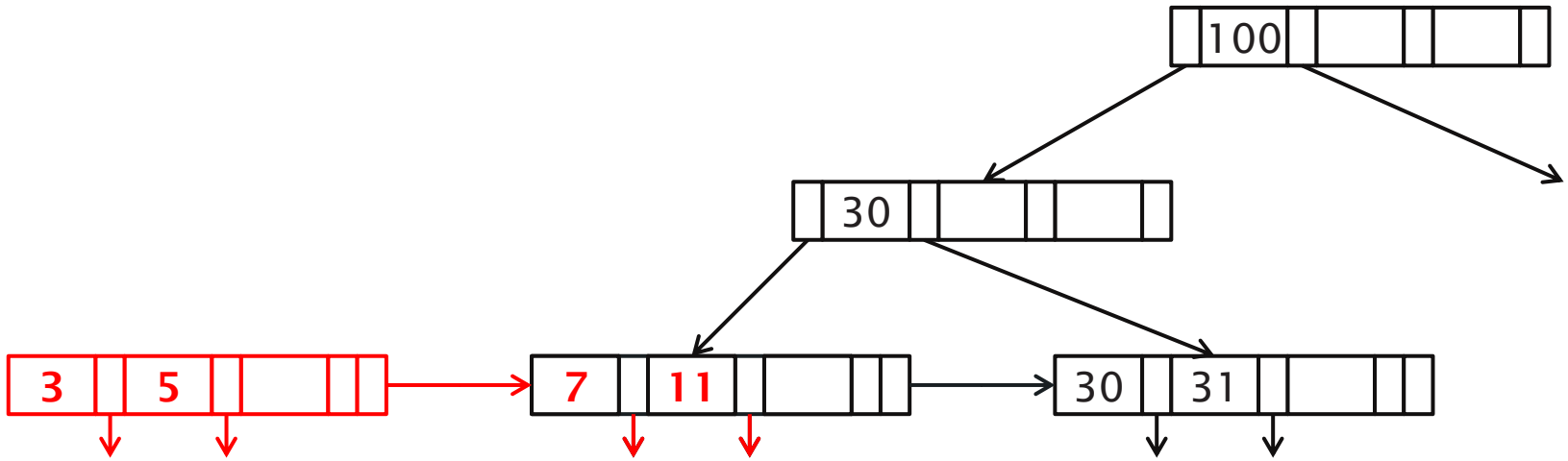
Case 1: insert key=32



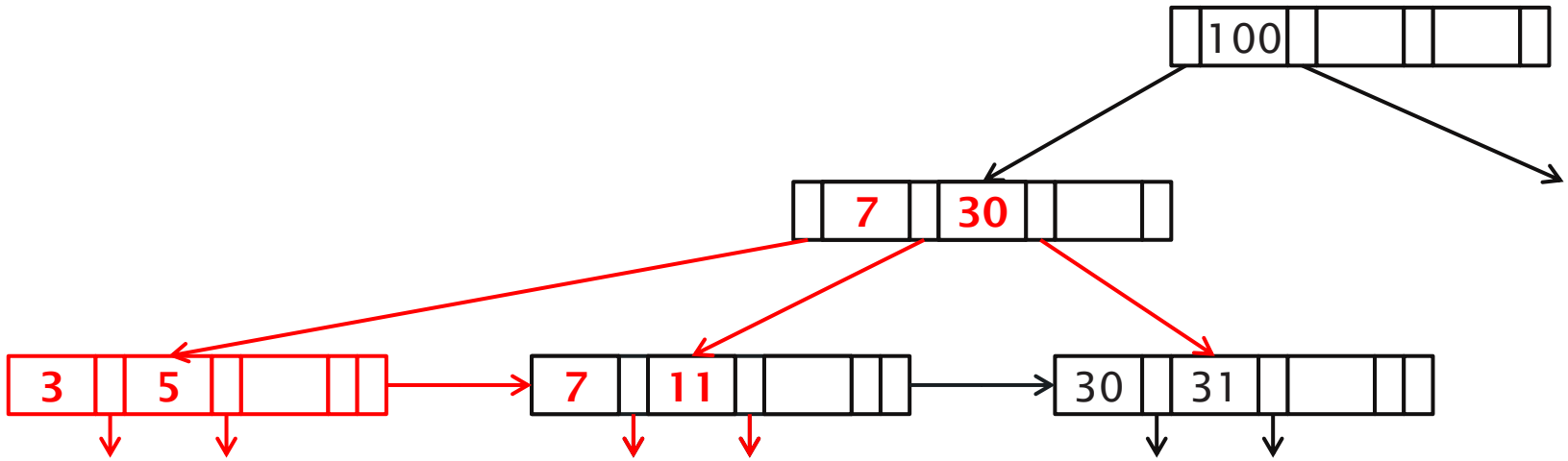
Case 2: insert key=7



Case 2: insert key=7



Case 2: insert key=7



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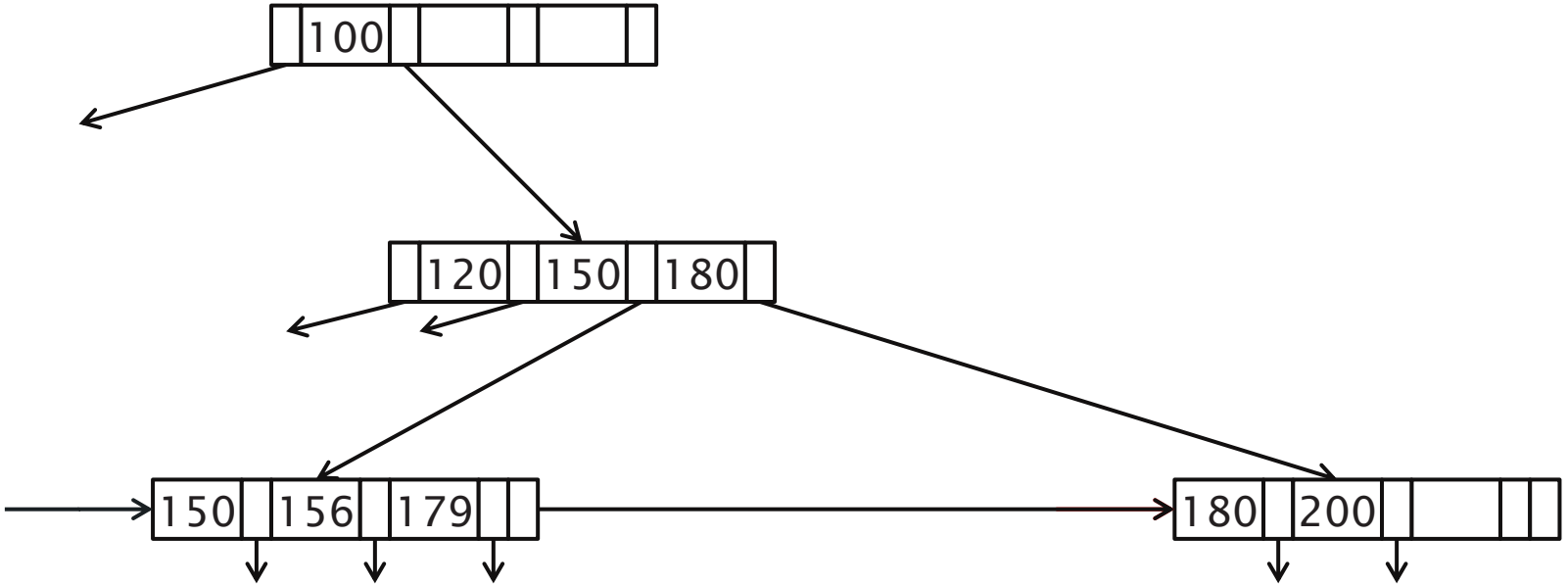
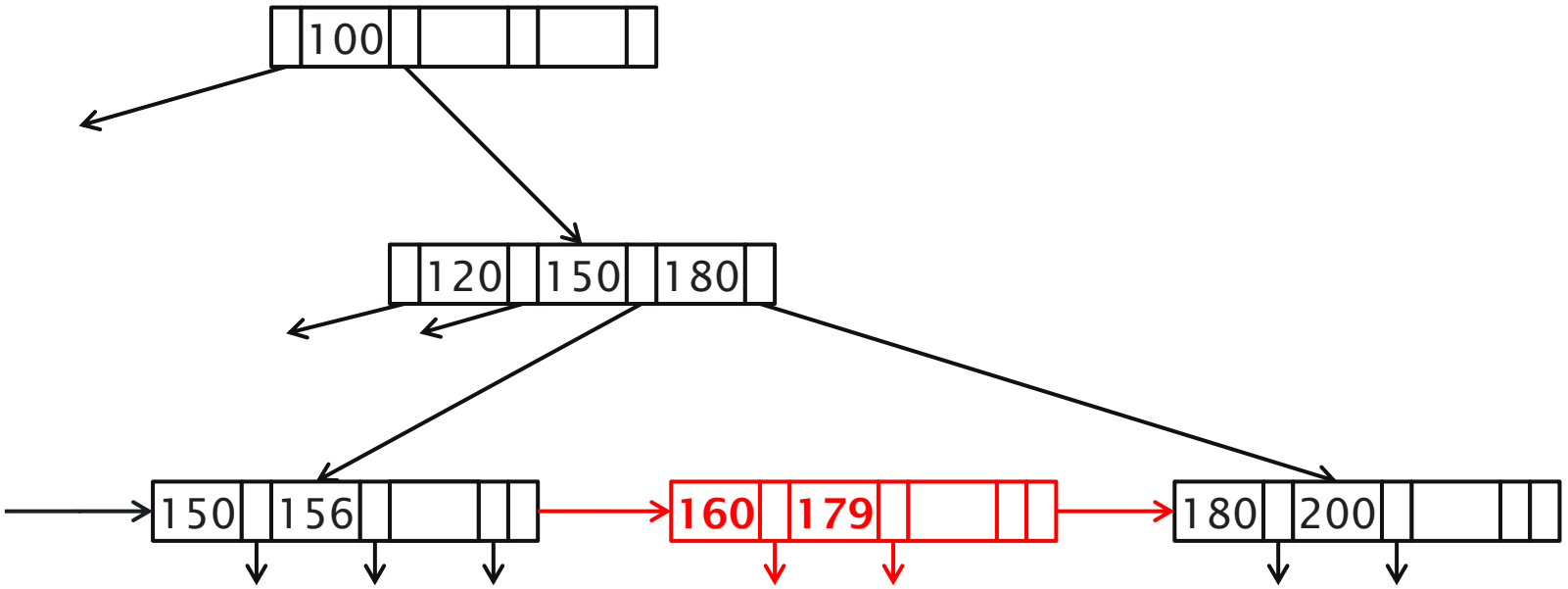
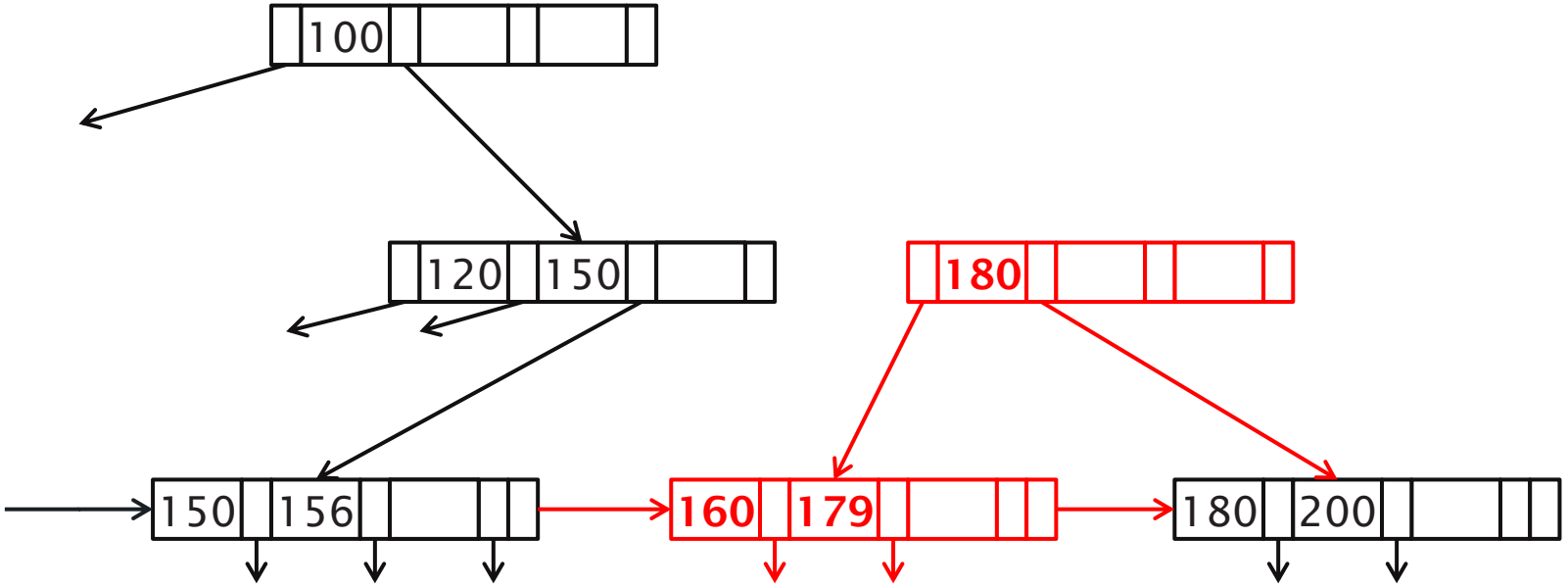
Case 3: insert key=160



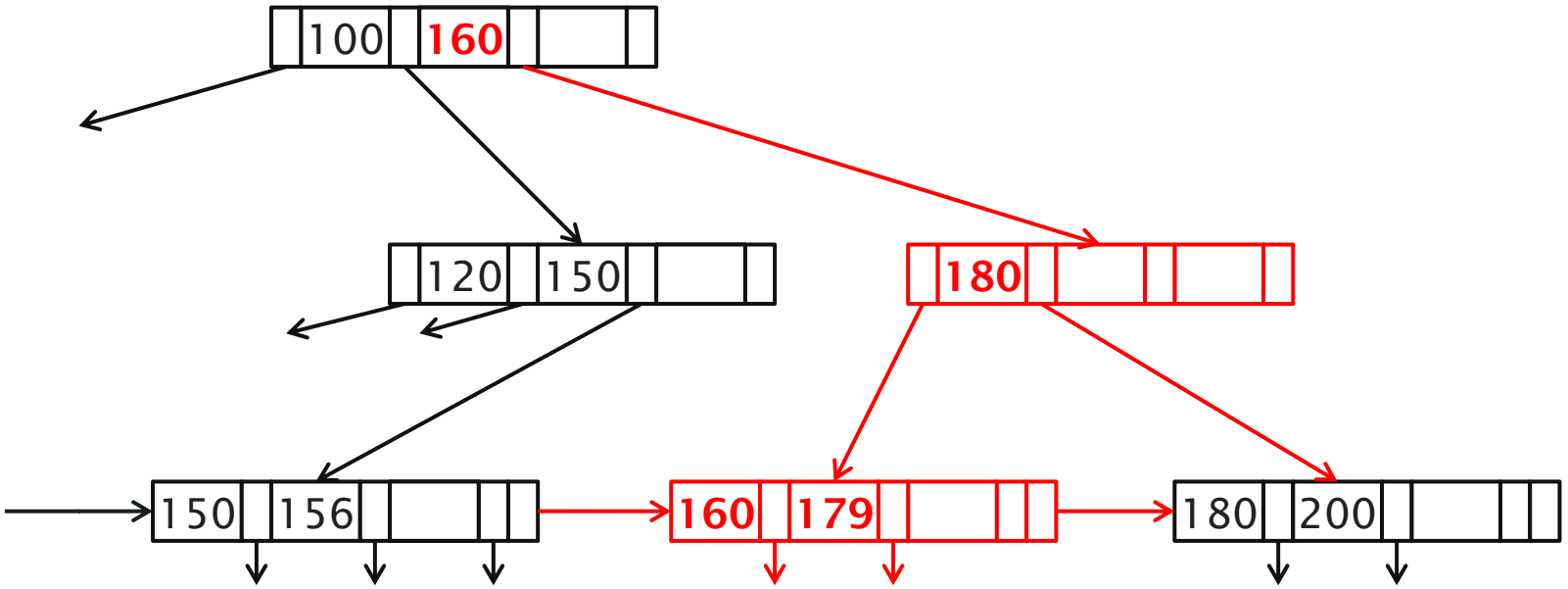
Case 3: insert key=160



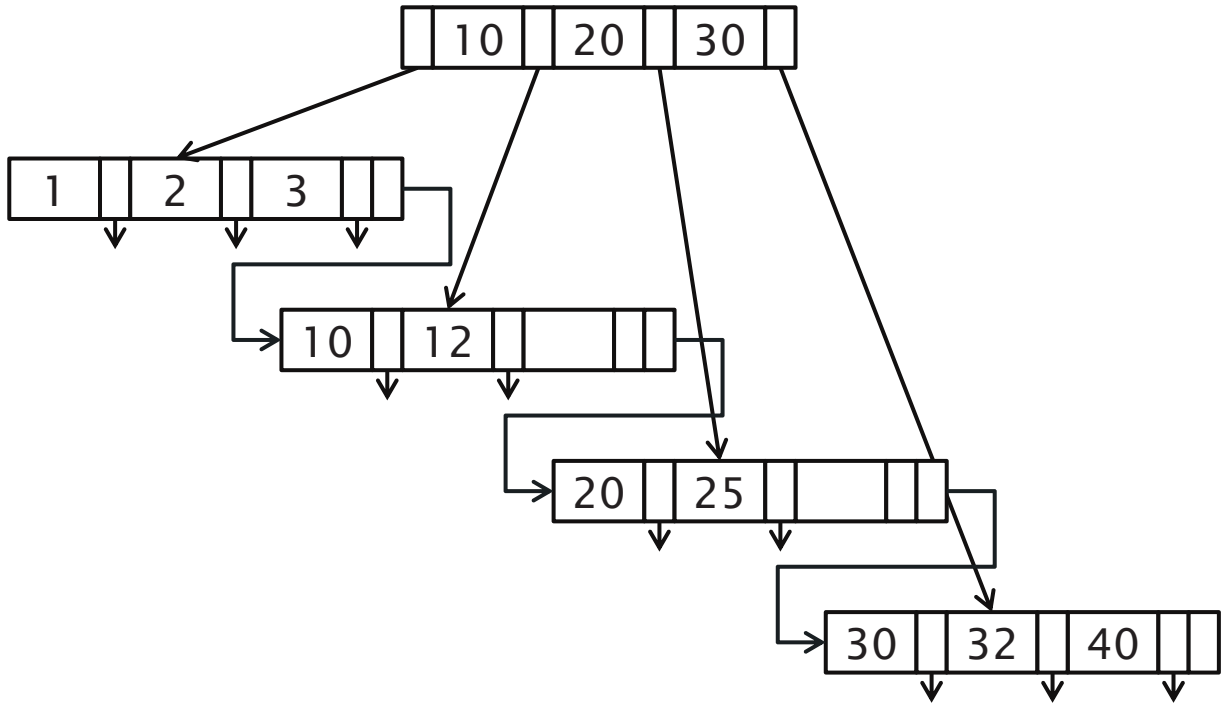
Case 3: insert key=160



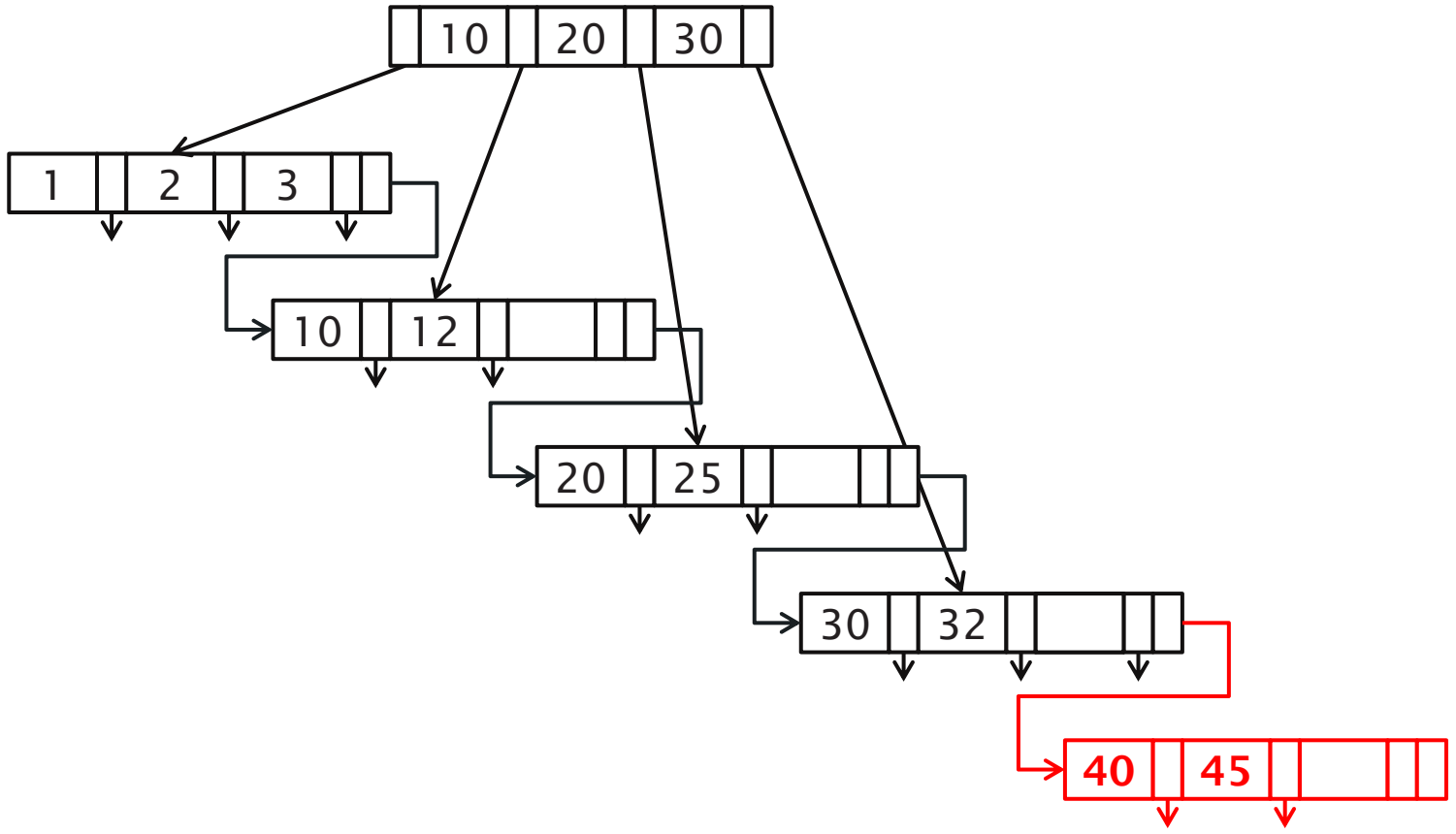
Case 3: insert key=160



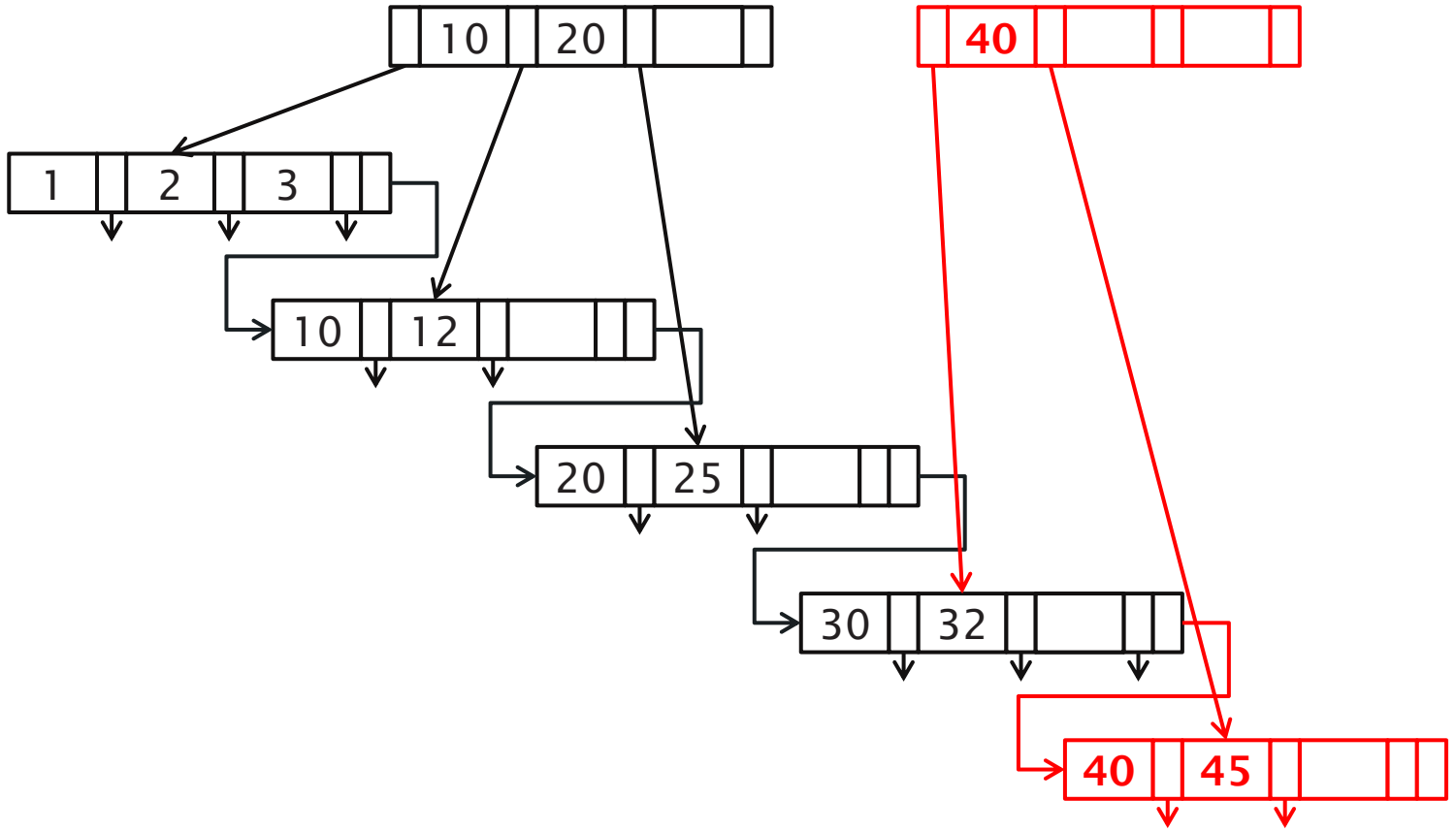
Case 4: insert 45



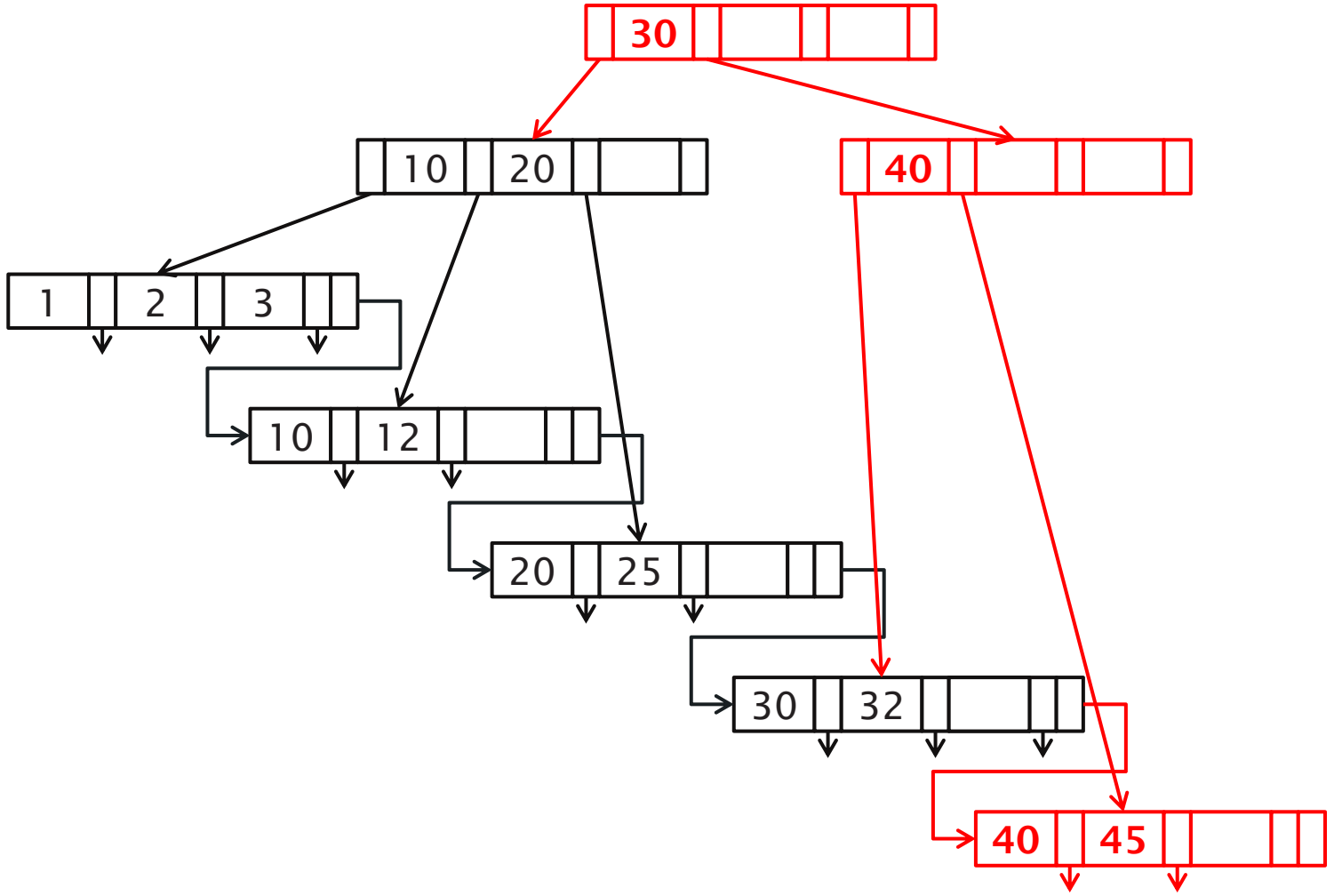
Case 4: insert 45



Case 4: insert 45



Case 4: insert 45

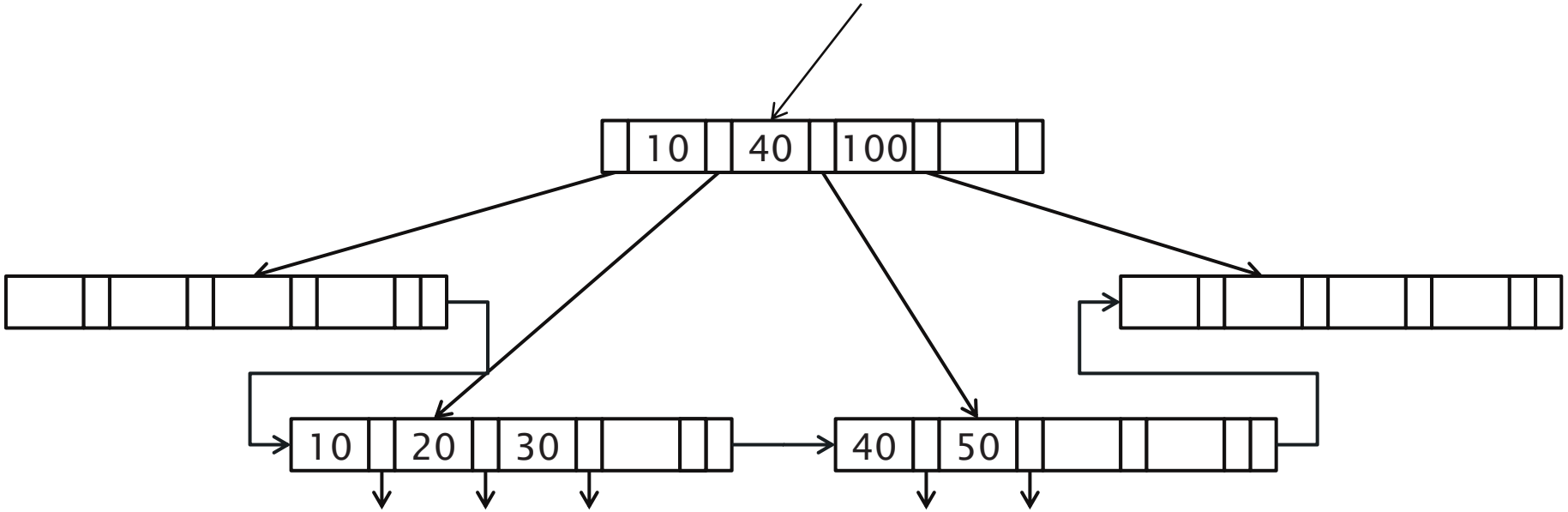


B+tree Deletion

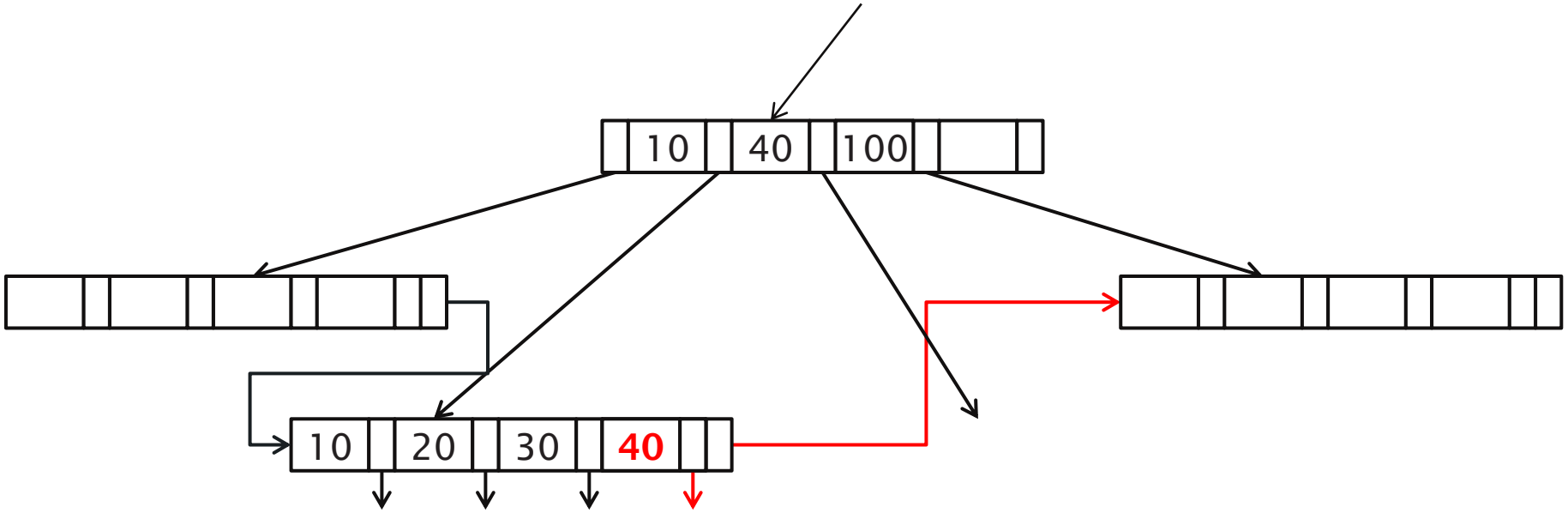
Four cases to consider:

1. Simple case
2. Coalesce with sibling
3. Re-distribute keys
4. Cases 2. or 3. at non-leaf

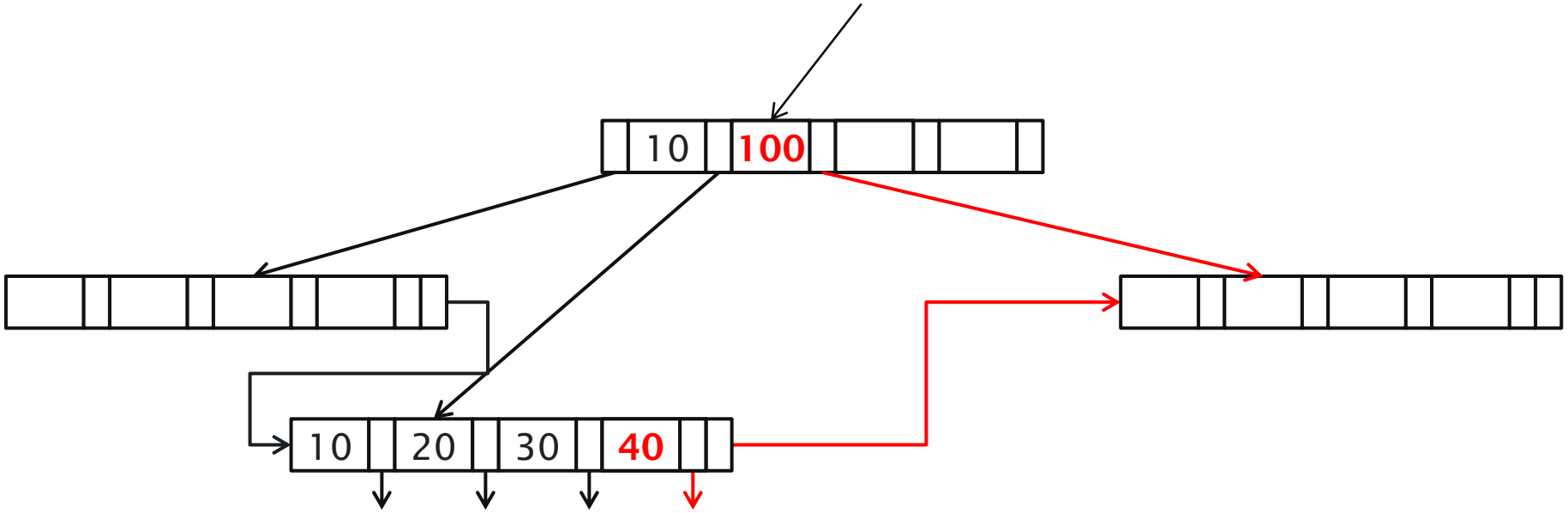
Case 2: delete key=50 (n=4)



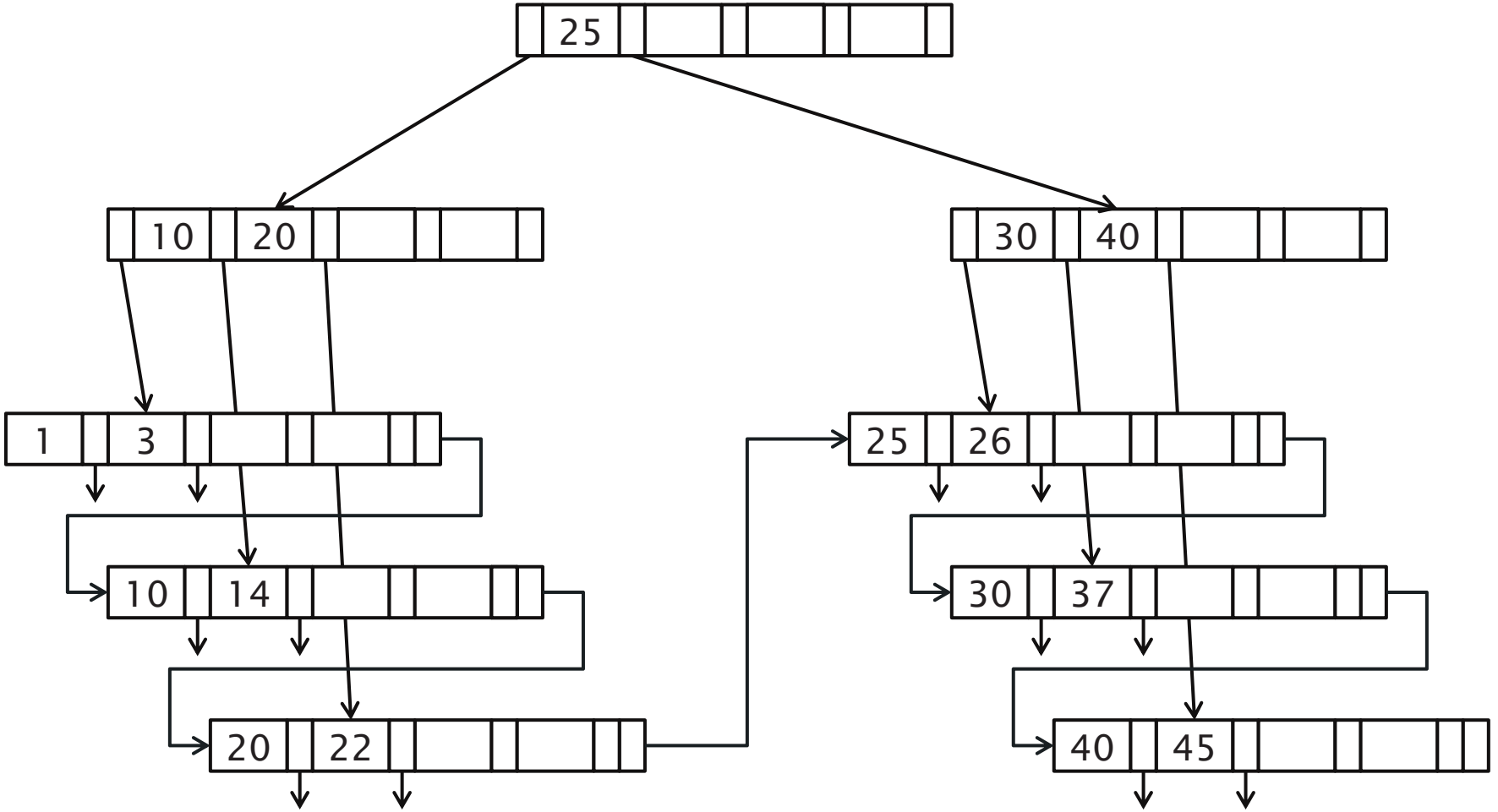
Case 2: delete key=50 (n=4)



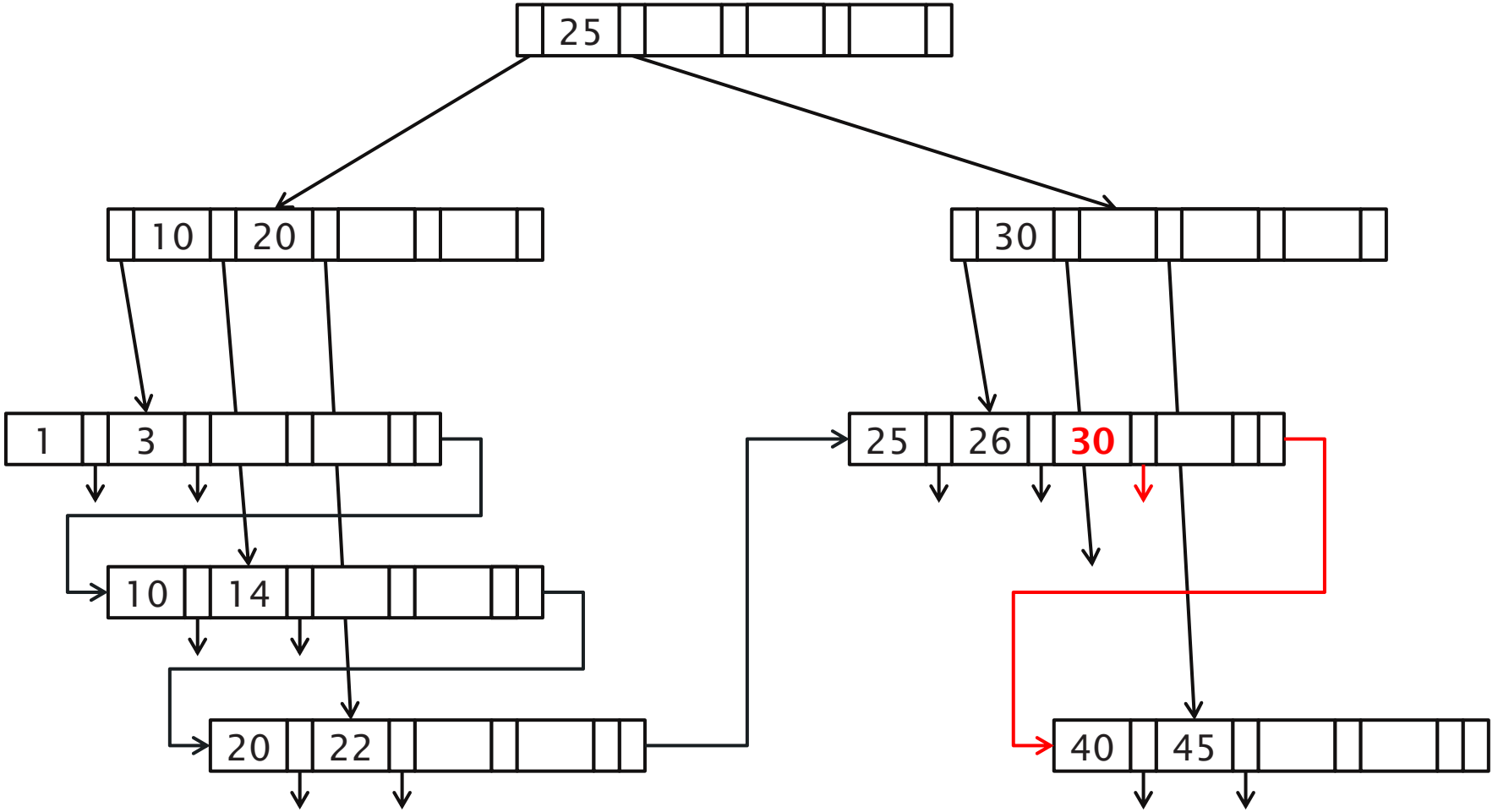
Case 2: delete key=50 (n=4)



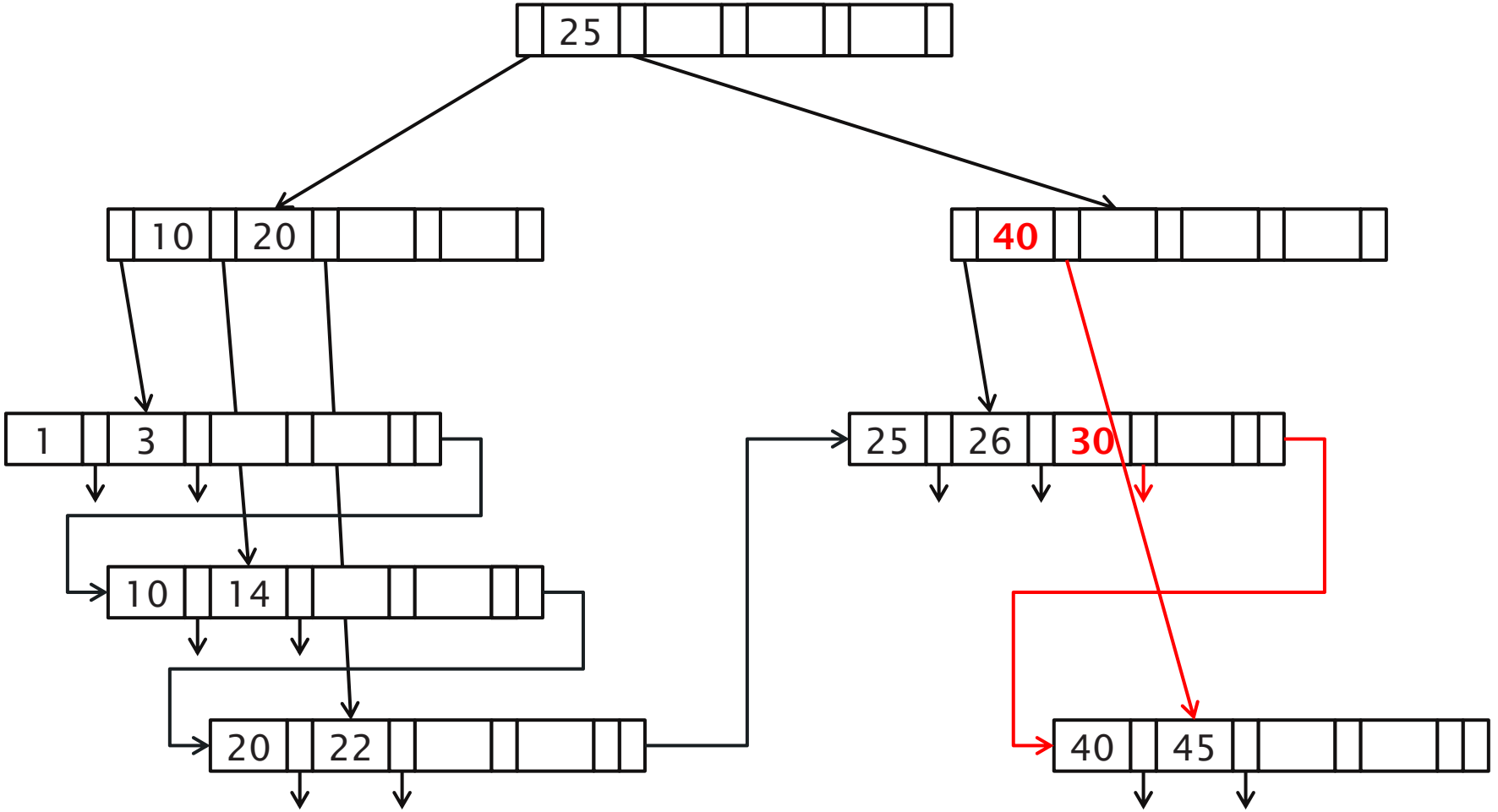
Case 4: delete key=37 (n=4)



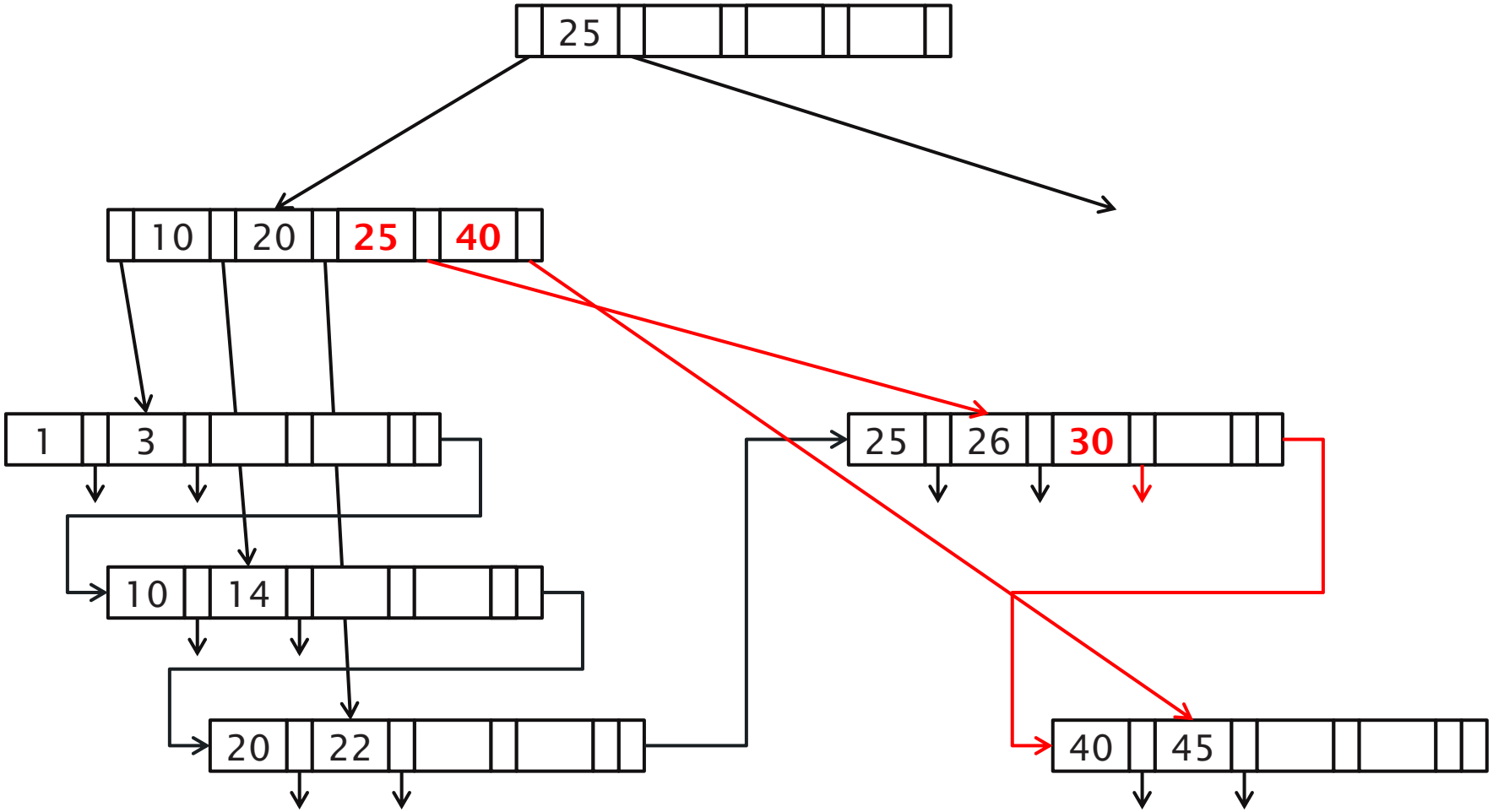
Case 4: delete key=37 (n=4)



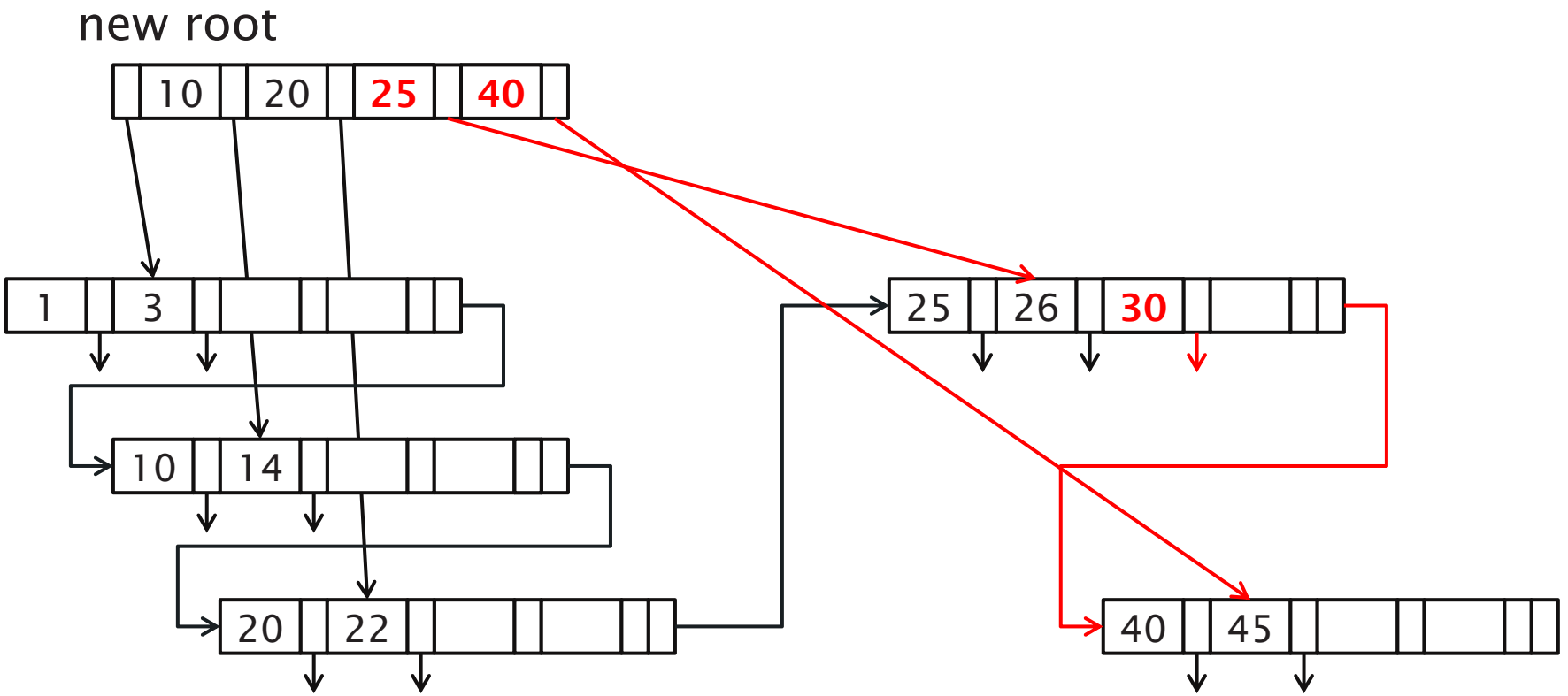
Case 4: delete key=37 (n=4)



Case 4: delete key=37 (n=4)



Case 4: delete key=37 (n=4)



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B+tree deletions in practice

Often, coalescing is not implemented

- Too hard and not worth it!

B-trees versus static indexed sequential files

B-trees consume more space

- Blocks are not contiguous
- Fewer disk accesses for static indexes, even allowing for reorganisation

Concurrency control is harder in B-trees

but

DBA does not know:

- when to reorganise
- how full to load pages of new index

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Hashing

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Hashing

Main memory hash table

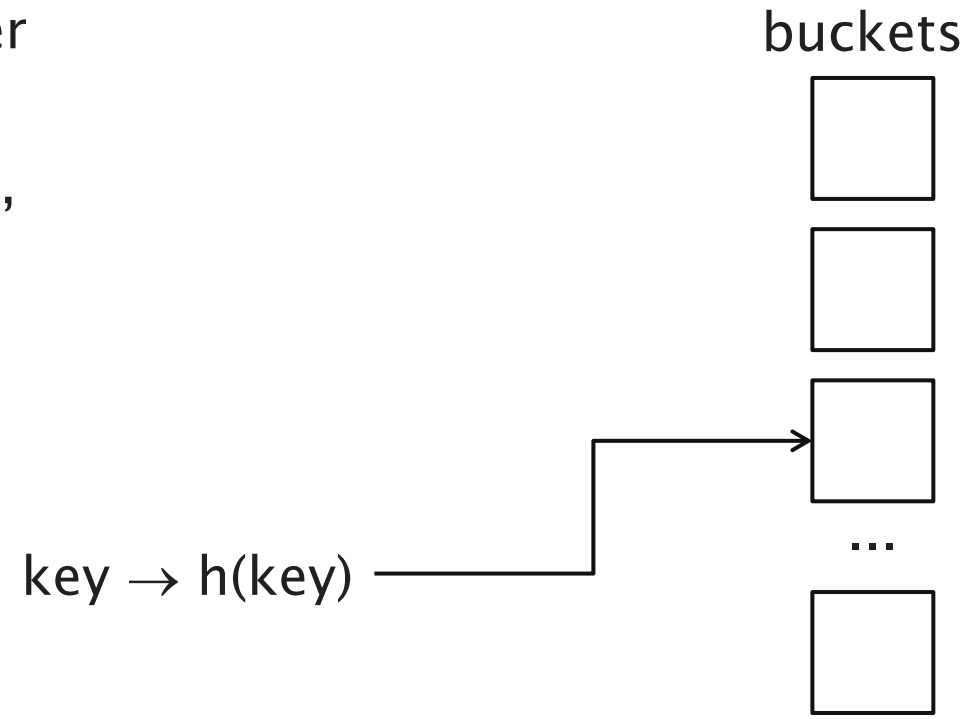
- *Hash function* h() takes a key and computes an integer value
- Value is used to select a bucket from a *bucket array*
- Bucket array contains linked lists of records

Secondary storage hash table

- Stores many more records than a main memory hash table
- Bucket array consists of disk blocks

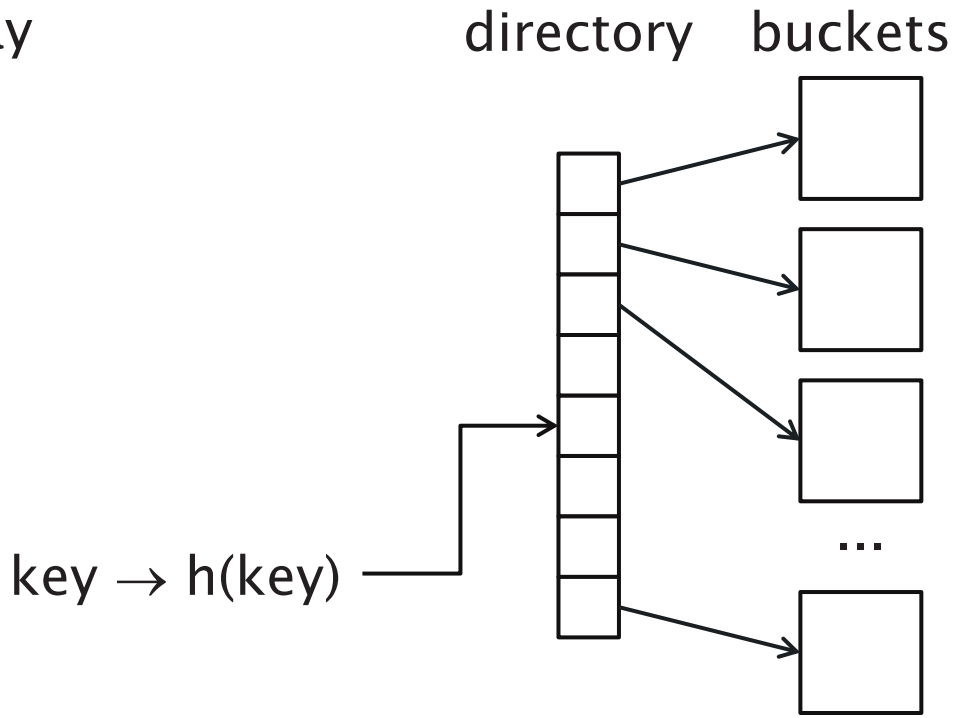
Hashing approach #1

- Hash function calculates block pointer directly, or as offset from first block
- Requires bucket blocks to be in fixed, consecutive locations



Hashing approach #2

- Hash function calculates offset in array of block pointers (directory)
- Used for “secondary” search keys



Example hash function

Key = ‘x1 x2 … xn’ (n byte character string), b buckets

h: add x1 + x2 + ….. xn, compute sum modulo b

Not a particularly good function

Good hash function has the same expected number of keys per bucket for each bucket

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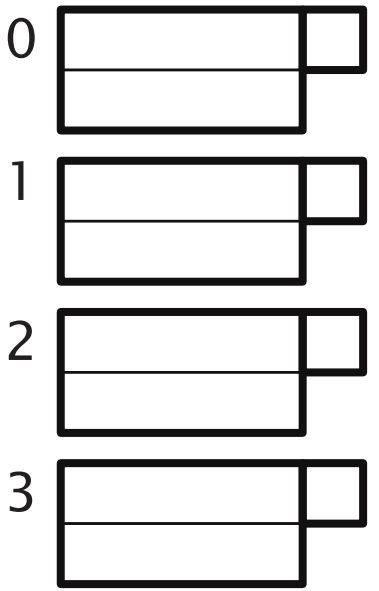
Buckets

Do we keep keys sorted?

Yes, if CPU time is critical and inserts/deletes are relatively infrequent

Hashing example

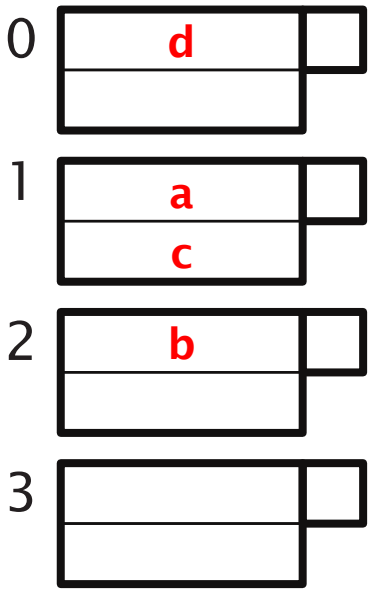
Two records per bucket



Hashing example

Insert a, b, c, d

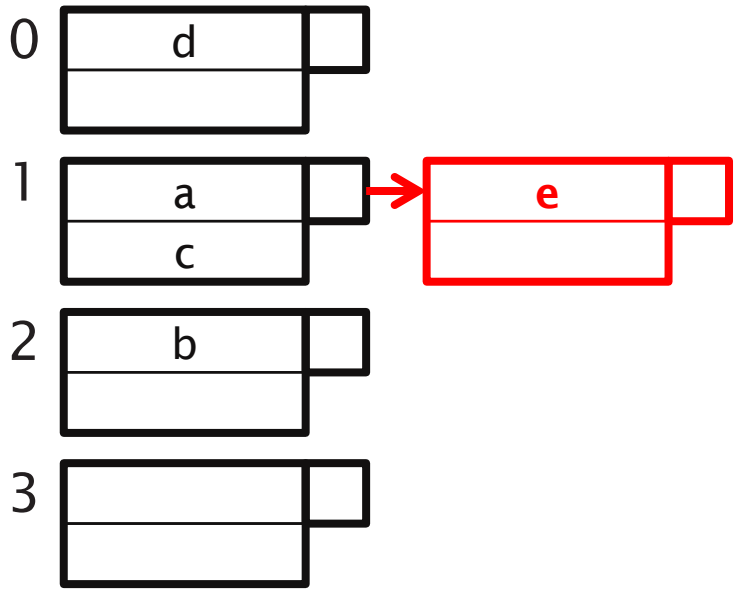
- h(a) = 1
- h(b) = 2
- h(c) = 1
- h(d) = 0



Hashing example: Overflow

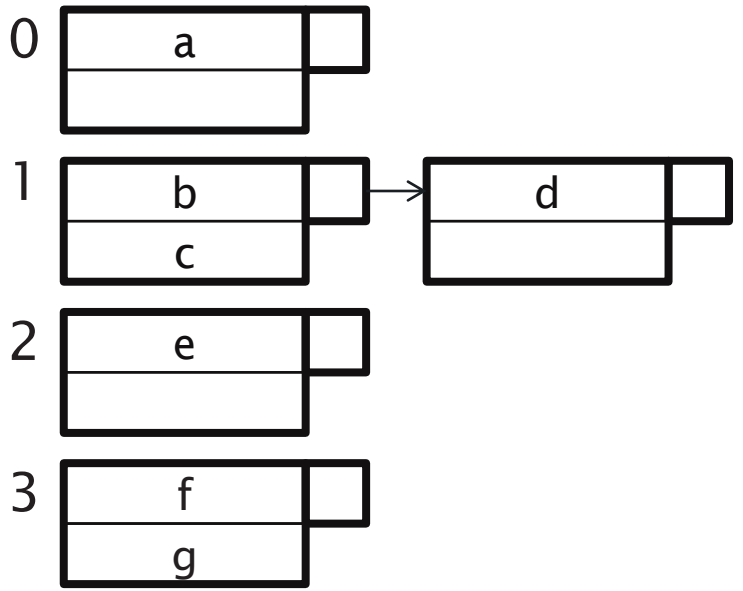
Insert e

- h(e) = 1



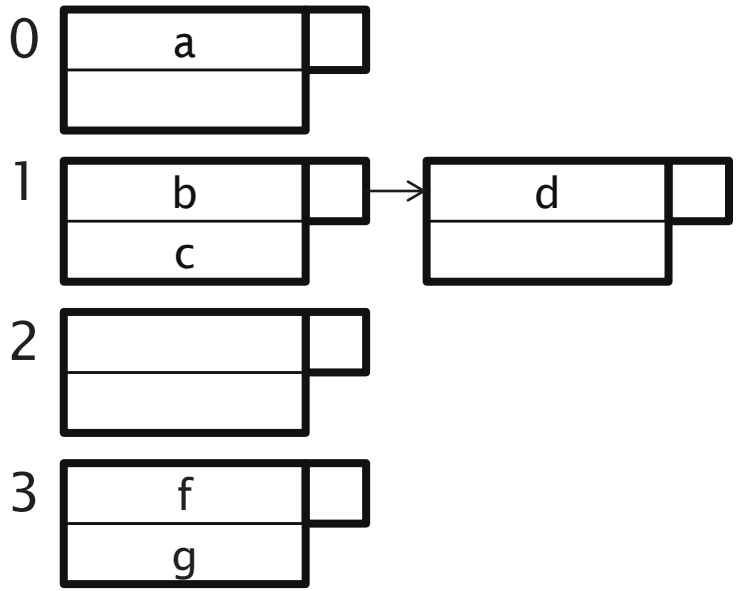
Hashing example: Deletion

Delete e



Hashing example: Deletion

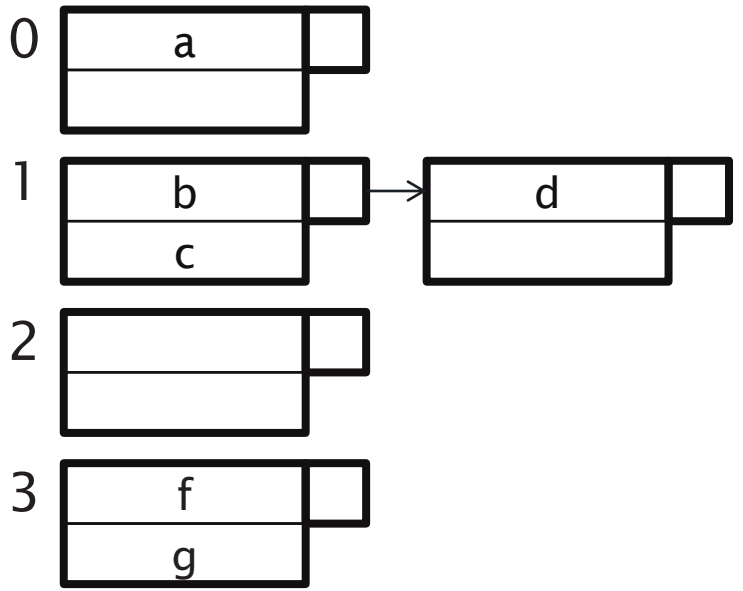
Delete e



Hashing example: Deletion

Delete f

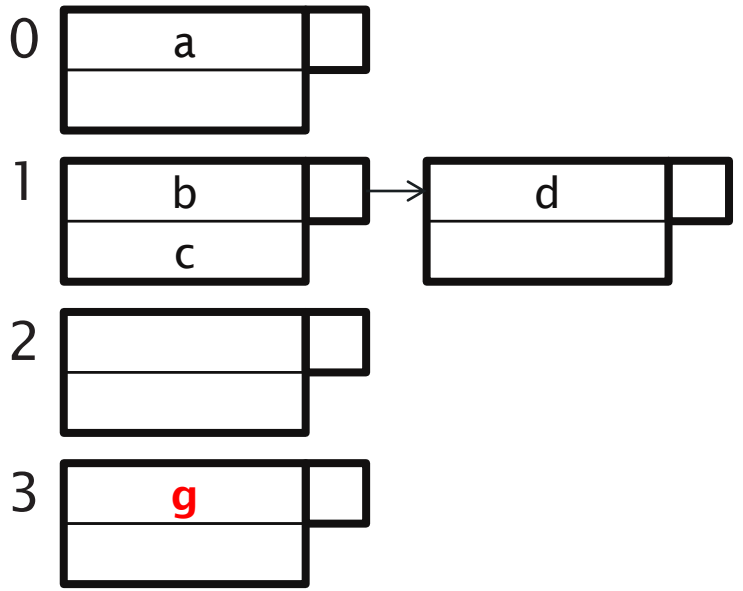
(move g up)



Hashing example: Deletion

Delete f

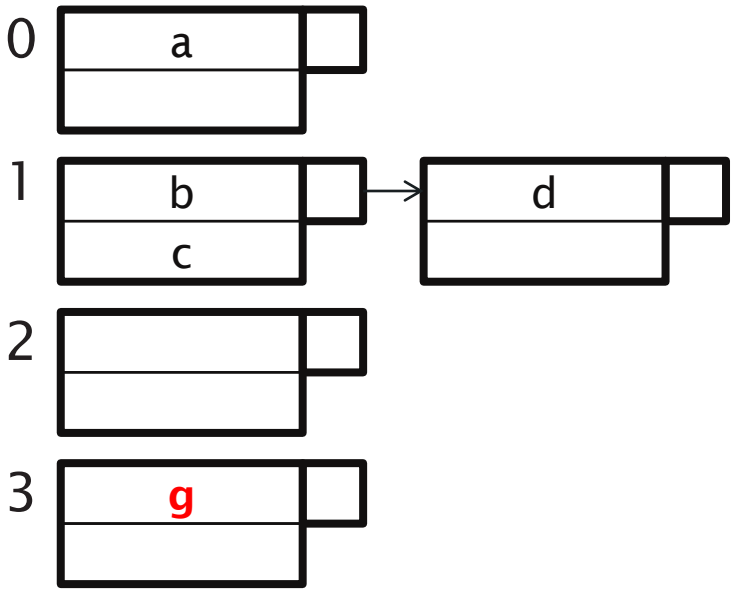
(move g up)



Hashing example: Deletion

Delete f

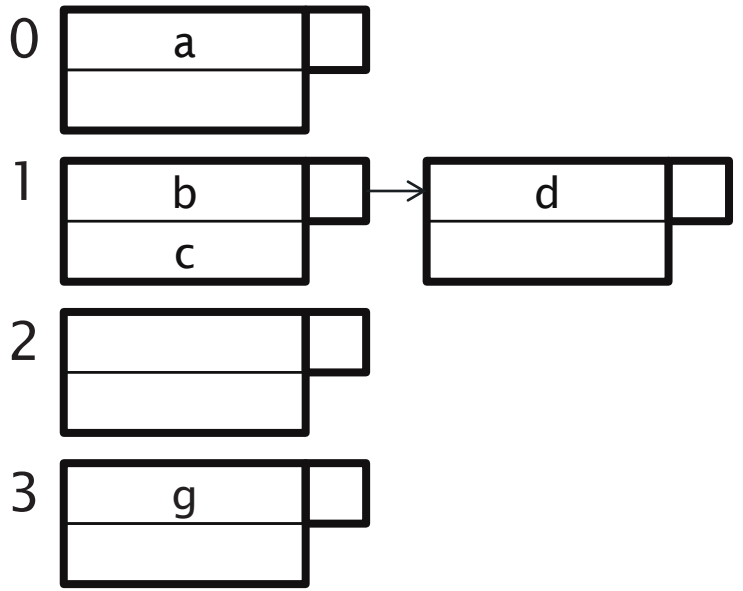
(move g up)



Hashing example: Deletion

Delete c

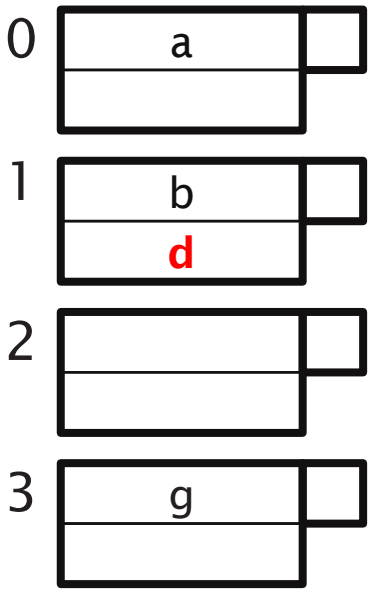
(move d from overflow block)



Hashing example: Deletion

Delete c

(move d from overflow block)



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Rule of thumb:

Space utilisation should be between 50% and 80%

Utilisation = #keys used / total #keys that fit

If < 50%, wasting space

If > 80%, overflows significant

Depends on how good hash function is and on #keys/bucket

How do we cope with growth?

Overflows and reorganizations

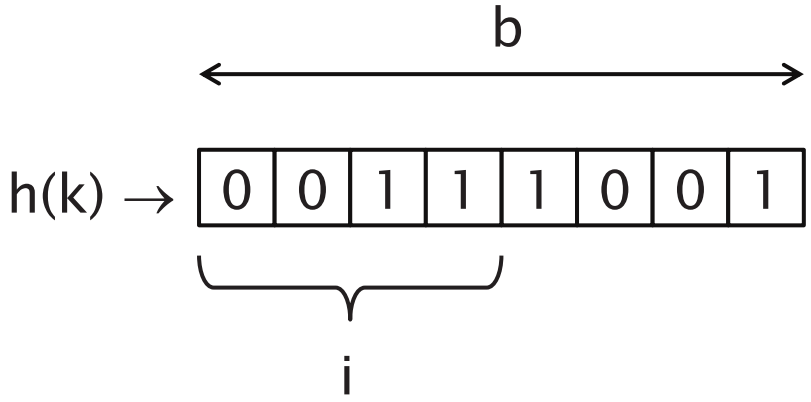
Dynamic hashing

- Extensible
- Linear

Extensible hashing

Combines two ideas:

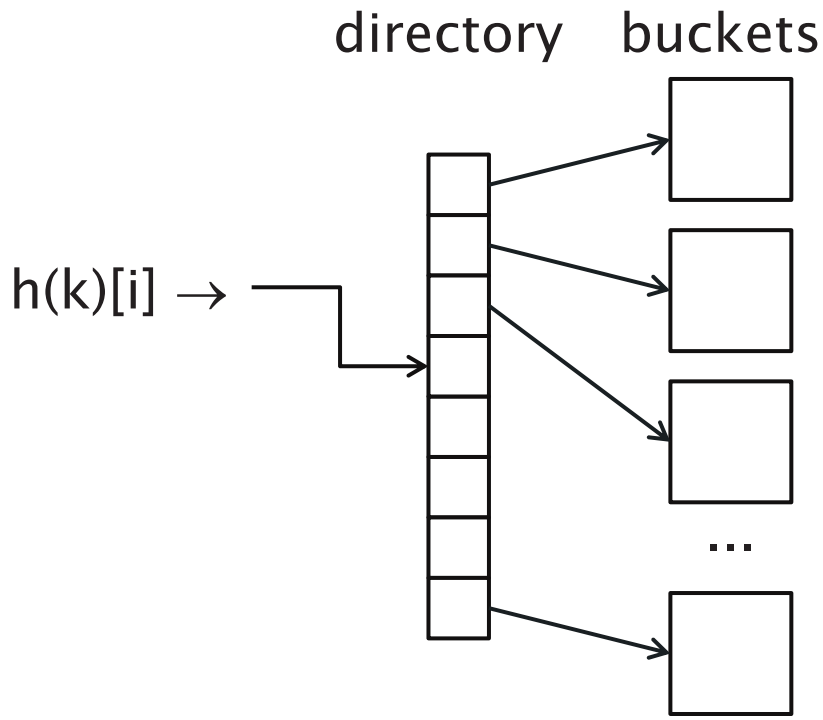
1. Use i of b bits output by hash function, where i grows over time



Extensible hashing

Combines two ideas:

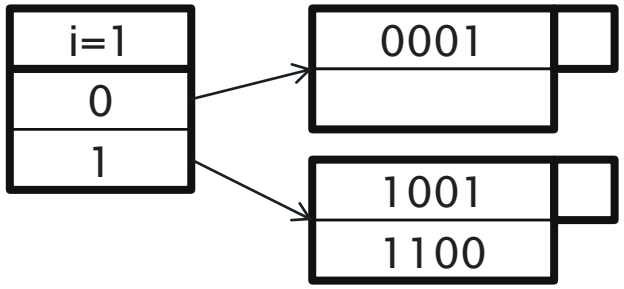
1. Use i of b bits output by hash function, where i grows over time
2. Use a directory



Example

h(k) gives 4 bits

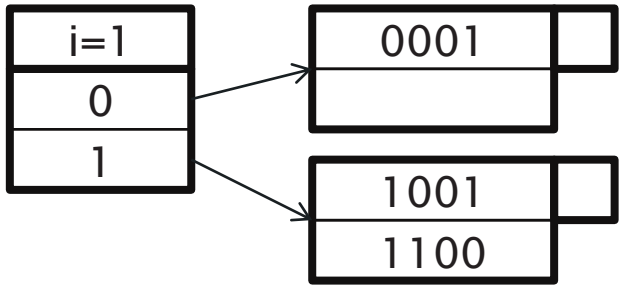
2 keys/bucket



Example

Insert 1010

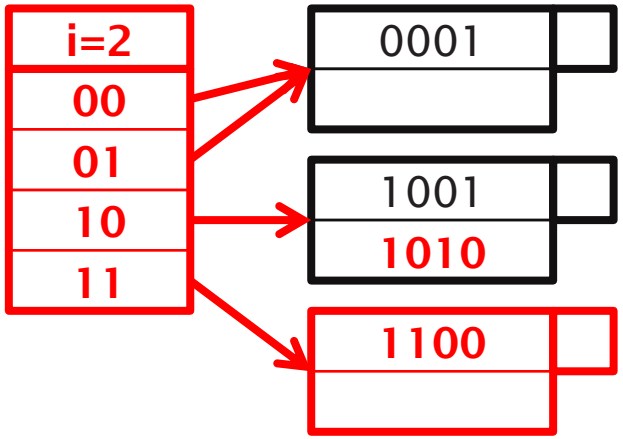
- Bucket overfull



Example

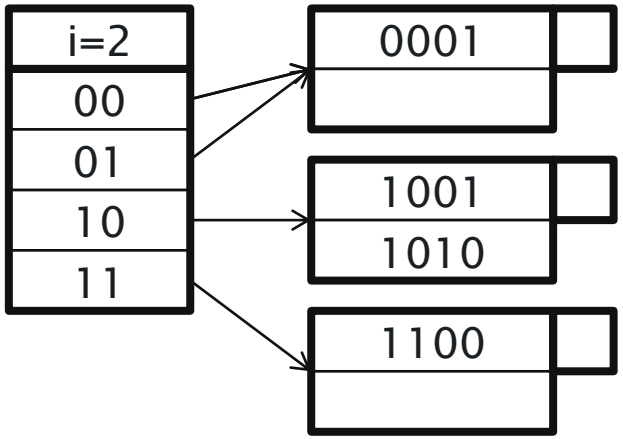
Insert 1010

- Bucket overfull
- Extend (double) directory
- Split bucket



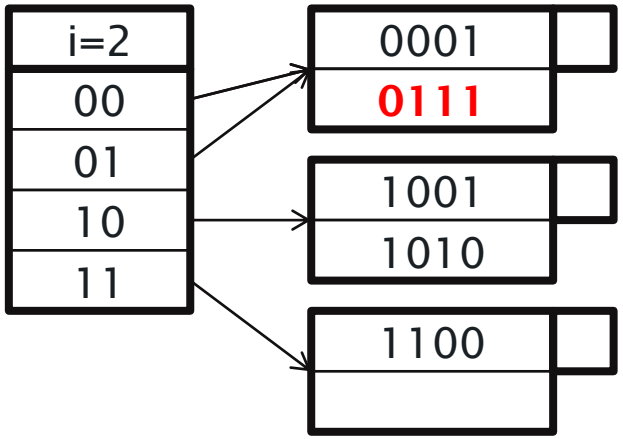
Example

Insert 0111



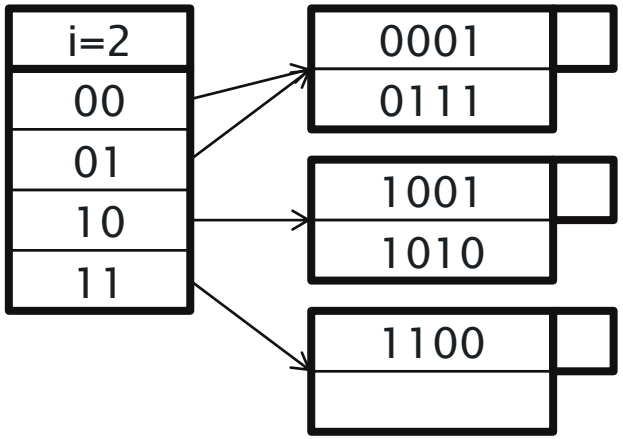
Example

Insert 0111



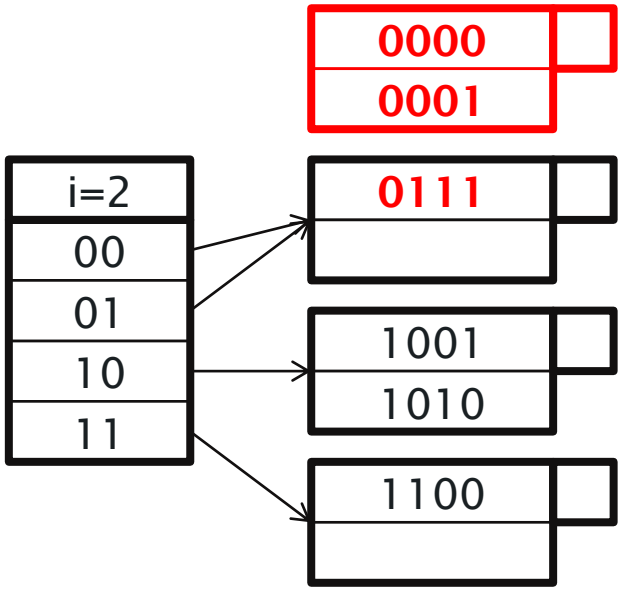
Example

Insert 0000



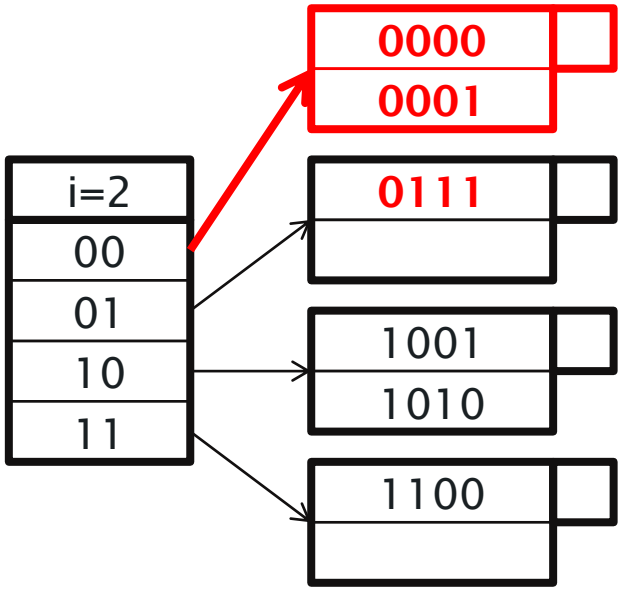
Example

Insert 0000



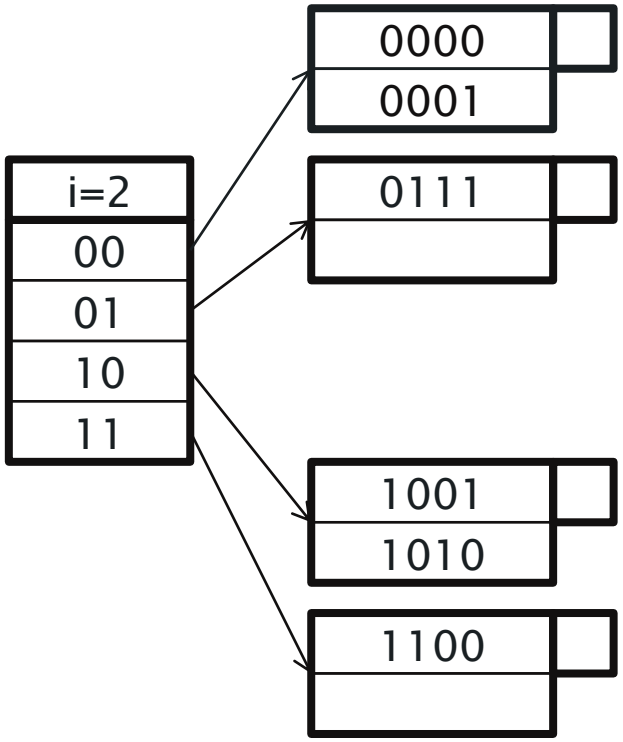
Example

Insert 0000



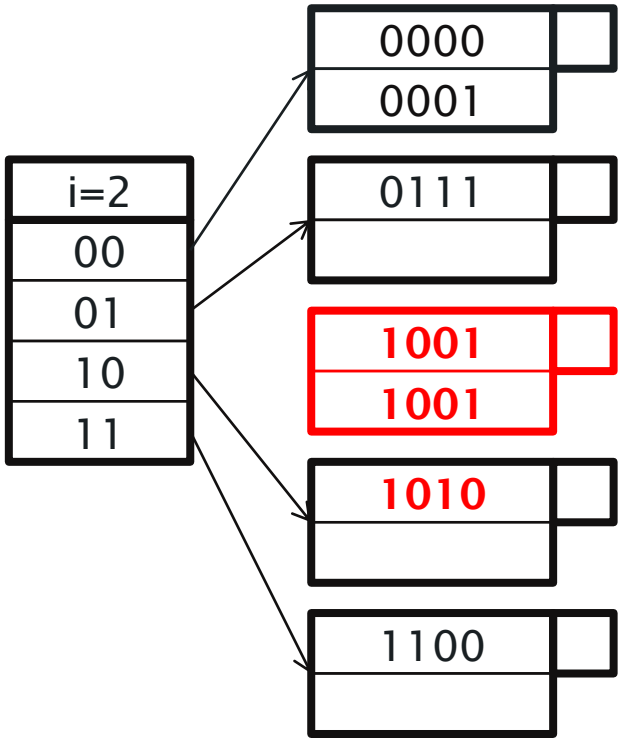
Example

Insert 1001



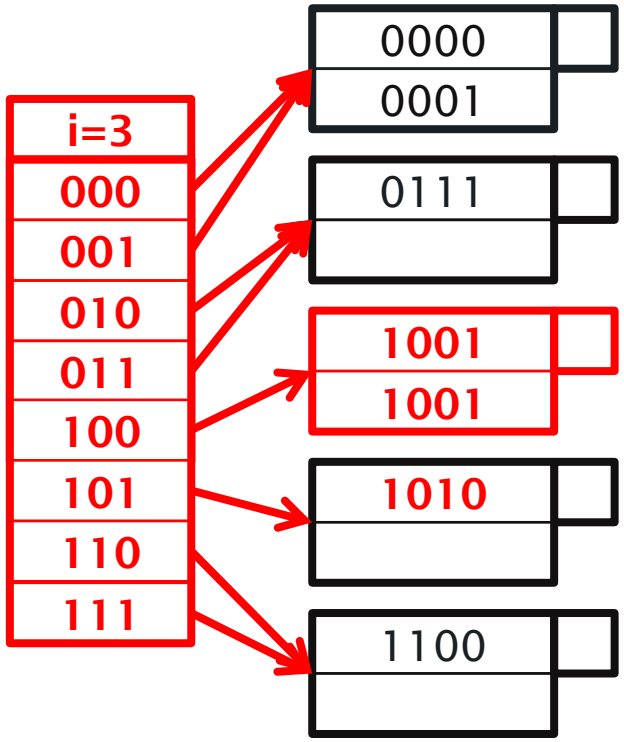
Example

Insert 1001



Example

Insert 1001



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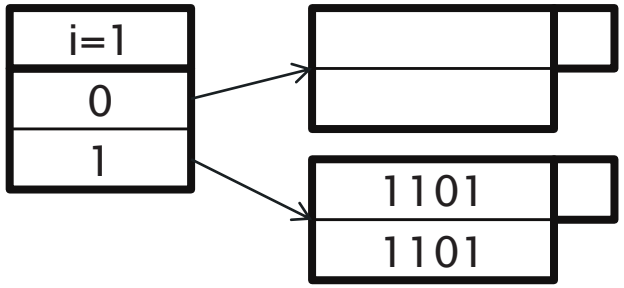
Extensible hashing: deletion

- No merging of blocks
- Merge blocks and cut directory if possible
- (Reverse insert procedure)

Overflow chains

Example: many records with duplicate keys

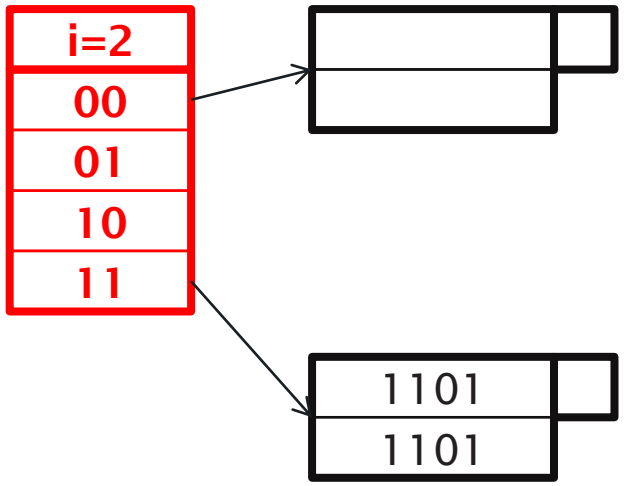
- Insert 1100



Overflow chains

Example: many records with duplicate keys

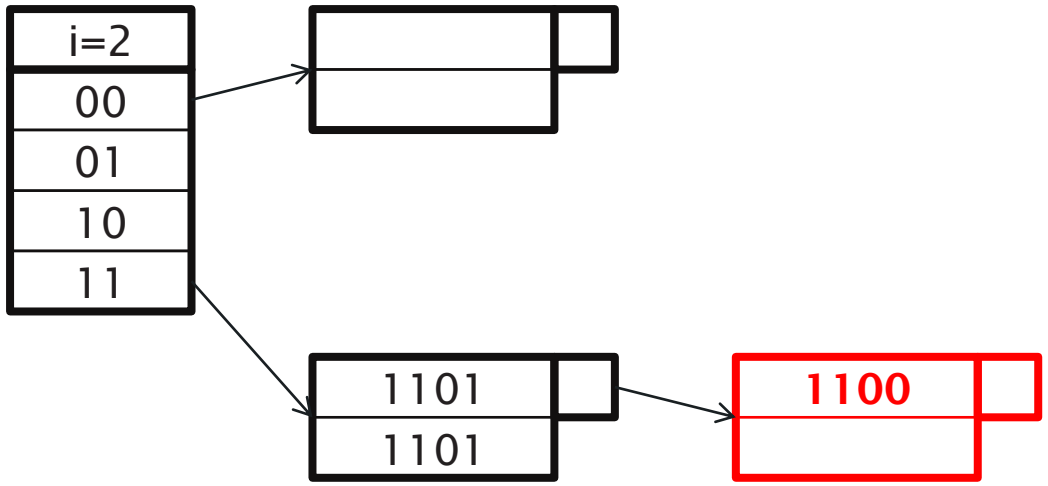
- Insert 1100



Overflow chains

Example: many records with duplicate keys

- Insert 1100
- Add overflow block



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Summary

Pro

- Can handle growing files
  - with less wasted space
  - with no full reorganizations

Con

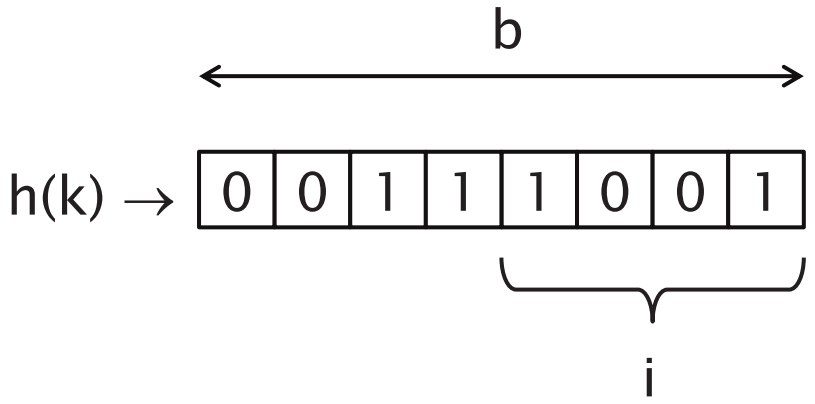
- Indirection
  - not bad if directory in memory
- Directory doubles in size
  - now it fits in memory, now it doesn't
  - suddenly increase in disk accesses!

Linear hashing

Another dynamic hashing scheme

Combines two ideas

1. Use i least significant bits of hash, where i grows over time

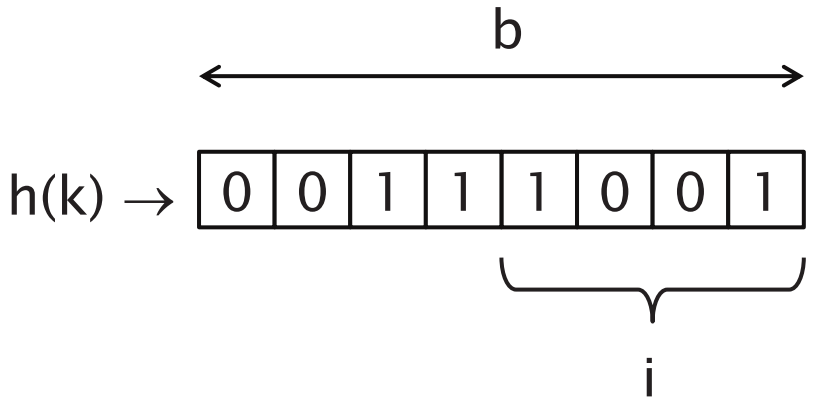


Linear hashing

Another dynamic hashing scheme

Combines two ideas

1. Use i least significant bits of hash, where i grows over time
2. Hash file grows incrementally and linearly
   (unlike extensible hash file, which periodically doubles)



Linear hashing

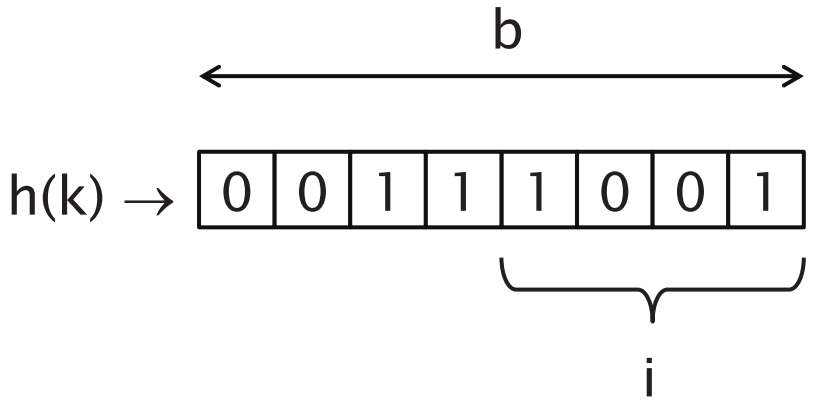
Another dynamic hashing scheme

Combines two ideas

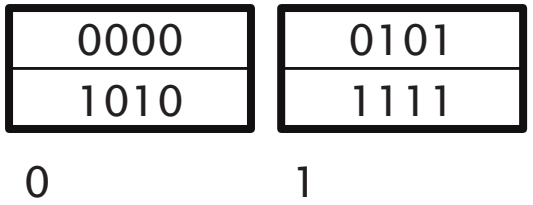
1. Use i least significant bits of hash, where i grows over time
2. Hash file grows incrementally and linearly
   (unlike extensible hash file, which periodically doubles)

Lookup rule:

if h(k)[i] ≤ m (maximum bucket index)
then look at bucket h(k)[i]
else look at bucket h(k)[i] - 2^{i-1}

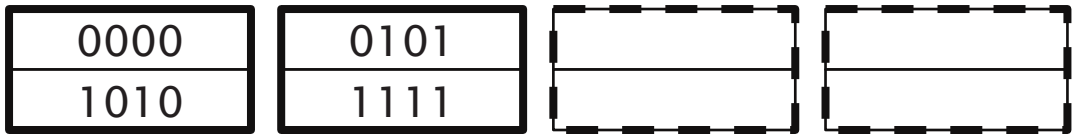


Example: b=4 bits, i=1, 2 keys/bucket



m = max used bucket = 1

Example: b=4 bits, i=2, 2 keys/bucket



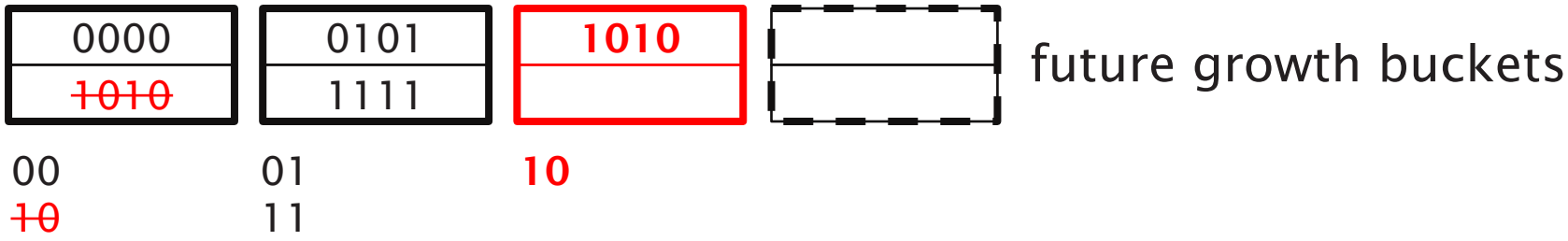
future growth buckets

00
10

01
11

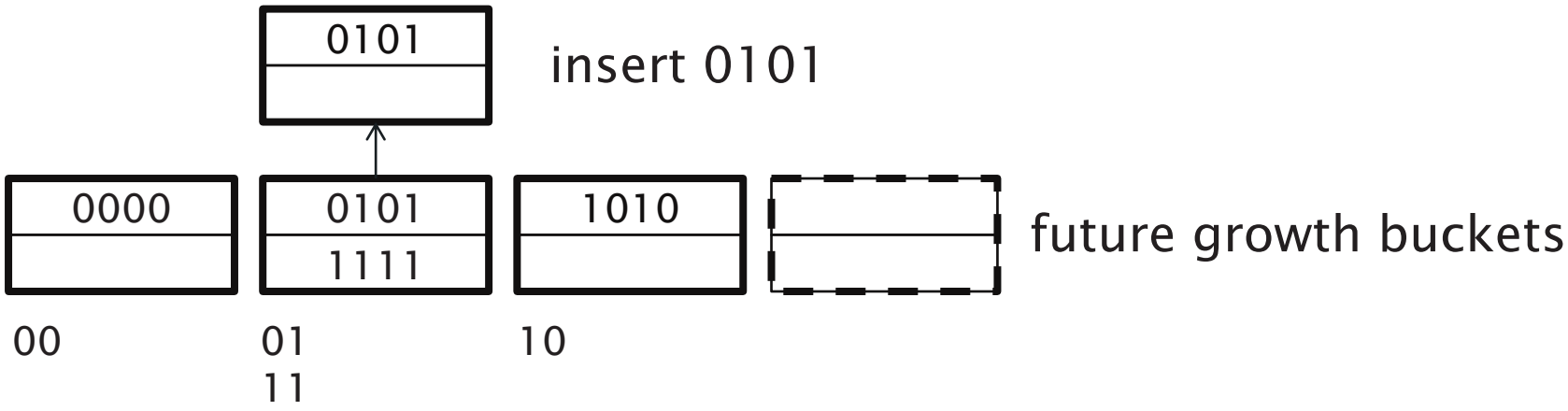
m = max used bucket = 01

Example: b=4 bits, i=2, 2 keys/bucket



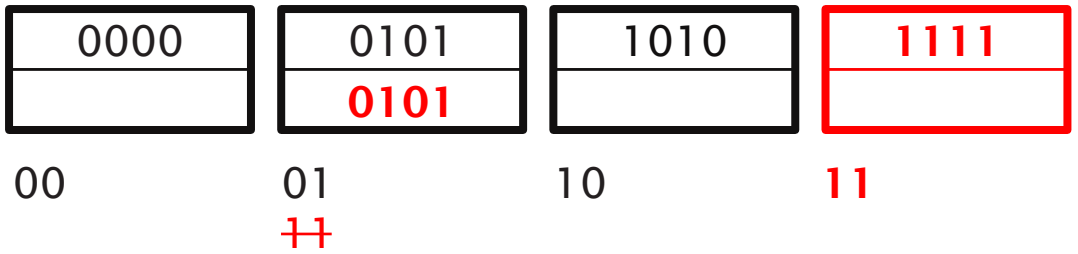
m = max used bucket = **10**

Example: b=4 bits, i=2, 2 keys/bucket



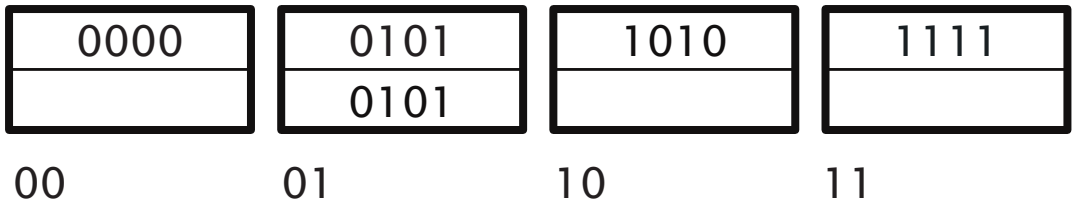
m = max used bucket = 10

Example: b=4 bits, i=2, 2 keys/bucket



m = max used bucket = **11**

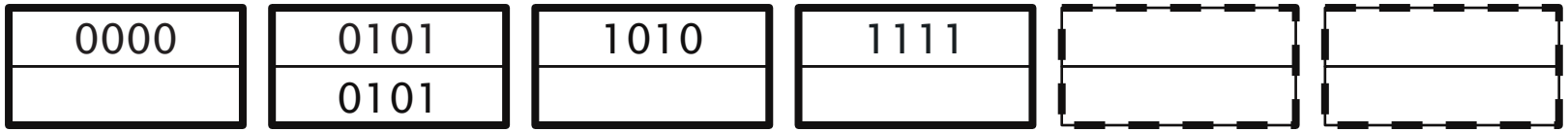
Example: further growth



future growth buckets

m = max used bucket = 11

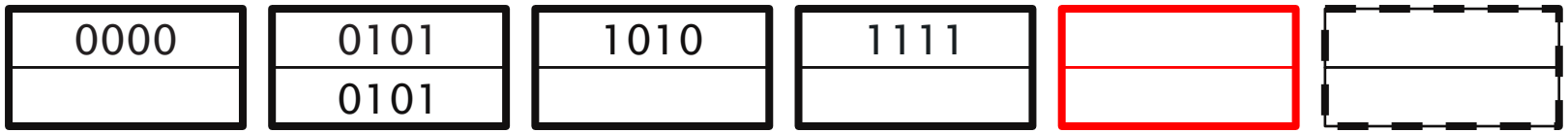
Example: i=3



000 001 010 011
100 101 110 111

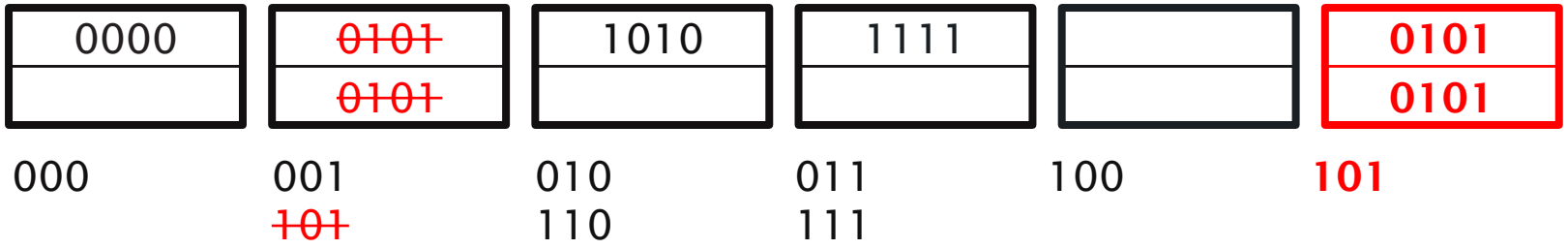
m = max used bucket = 11

Example: i=3



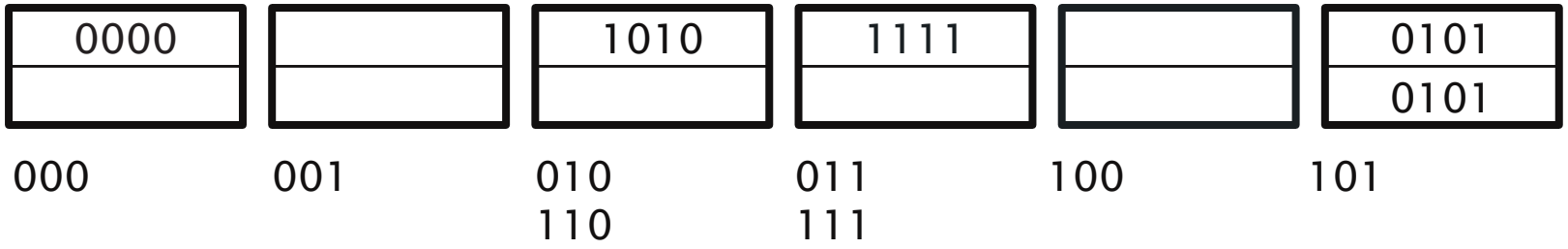
m = max used bucket = **100**

Example: i=3



m = max used bucket = **101**

Example: i=3



m = max used bucket = 101

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When do we expand file?

Keep track of utilisation

U = #used slots / total #slots

If U > threshold, then increase m (and maybe i)

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Linear Hashing

Pro

- Can handle growing files
  - with less wasted space
  - with no full reorganizations
- No indirection like extensible hashing

Con

- Can still have overflow chains

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Indexing versus Hashing

Indexing vs Hashing

Hashing good for *probes* given a key:

```
SELECT ...
FROM R
WHERE R.A = 5
```

Indexing vs Hashing

Indexing (Including B-trees) good for *range searches*:

```
SELECT ...
FROM R
WHERE R.A > 5
```

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Further Reading

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Further Reading

- Chapter 14 of Garcia-Molina et al
  - Sections 14.1-14.3

- Next lecture: Multi-key Indexing
  - Sections 14.4-14.7

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Next Lecture:
Multidimensional Access Structures