### Final Exam Review

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Lecture 22

## Outline for today

- Identify topics for the final exam
- Discuss format of the final exam
  - What will be provided for you and what you can bring (and not bring)
- Review content

### Final Exam

- April 19, 2013 8:00 AM Shillman Hall
- Open books and open notes
  - But no portable devices (no laptops, no phones, etc.)
- 2 hour time period

### Lectures for the final exam

- 9 lectures all presentations are numbered with the corresponding lecture number
- All lectures included

## Text chapters for the final exam

- Chapters 8-11
  - 8. Overview of storage and indexing
  - 9. Storing data: disks and files
  - 10. Tree-structured indexing
    - Including section on B+ trees in Chapter 17 (17.5.2)
  - 11. Hash-based indexing
- Chapters 12-15
  - 12. Query Evaluation
  - 13. External Sorting
  - 14. Evaluating Relational Operators
  - 15. Typical Relational Operator

## Topics for the final exam

#### **Topics**

- File storage mechanisms
  - Abstraction:collection of records
  - Formats
  - Heap-based, Sorted, Indexed
  - RAID
- Buffer management
  - In relationship to the data manager
- Indexes
  - Primary vs. Secondary
  - Clustered vs. Unclustered
  - Tree-structured: ISAM, B+ trees
  - Hash-based indexes
- External Sort
- Query Evaluation
- Query Optimization
- NO SQL

#### **Algorithms**

- Cost model
  - Given a query, the approximate number of I/O's for different file storage mechanisms
- B+ tree bulk load
- Insertion/Deletion of records
  - B+ tree
  - ISAM
  - Extendible hashing
  - Linear hashing
- Query plan selection

### Format of the final exam

- 1-2 Algorithmic/Calculation problems (40%)
  - I/O calculations
  - B+ tree insertion/deletion
  - Construct or Choose a query plan
- 1-2 open-ended responses (30%)
  - SQL vs. NO SQL
    - ACID vs. BASE
    - CAP theorem
  - Comparison of Join algorithms
  - Sort algorithms
- Some close-ended responses (30%)
  - Short collection of True and False
  - Multiple choice
  - Short definitions

## Study Steps

- Go over the lecture notes
- Read the book
  - Summary section of the chapters are written well
- Go over homework 3
- Ask questions in piazza or via email
- Organize a study sheet
- Review algorithms

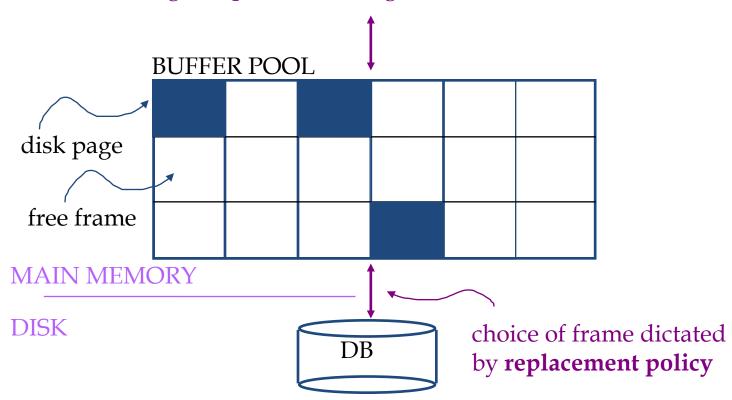
### **CONTENT REVIEW**

## Disk Space Manager

- Lowest layer of DBMS software manages space on disk.
- Higher levels call upon this layer to:
  - allocate/de-allocate a page
  - read/write a page
- Request for a sequence of pages must be satisfied by allocating the pages sequentially on disk! Higher levels don't need to know how this is done, or how free space is managed.

## Buffer Management in a DBMS

Page Requests from Higher Levels

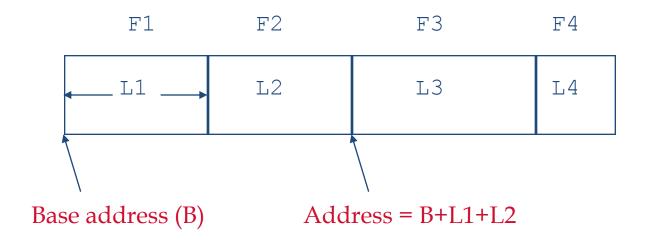


- Data must be in RAM for DBMS to operate on it!
- Table of <frame#, pageid> pairs is maintained.

## File structure types

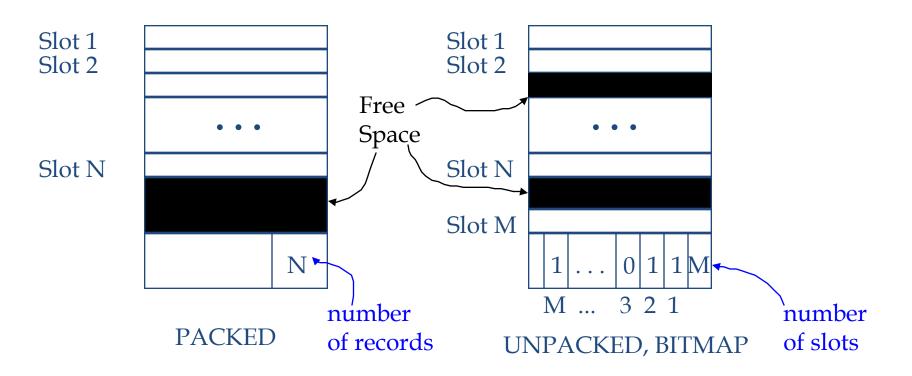
- Heap (random order) files
  - Suitable when typical access is a file scan retrieving all records.
- Sorted Files
  - Best if records must be retrieved in some order, or only a `range' of records is needed.
- Indexes = data structures to organize records via trees or hashing.
  - Like sorted files, they speed up searches for a subset of records, based on values in certain ("search key") fields
  - Updates are much faster than in sorted files.

## Record Formats: Fixed Length



- Information about field types same for all records in a file; stored in system catalogs.
- Finding i'th field requires scan of record.

### Page Formats: Fixed Length Records

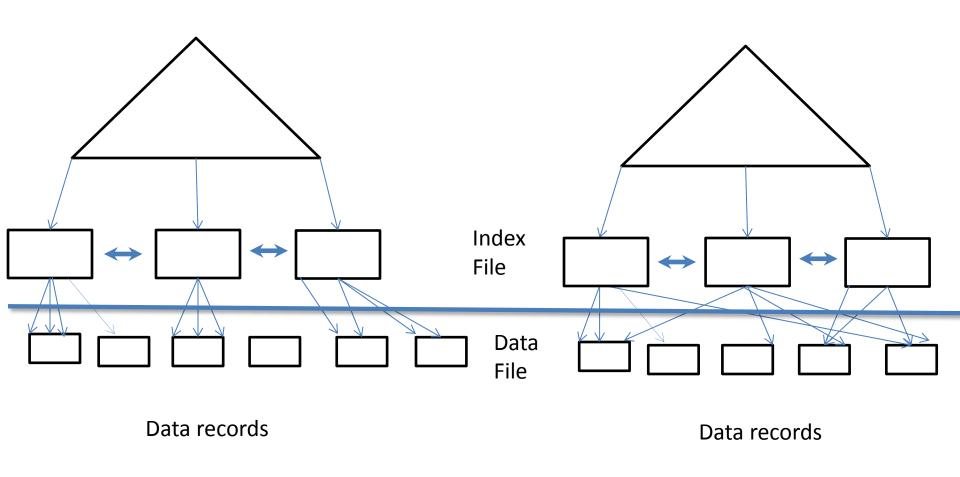


<u>Record id</u> = <page id, slot #>. In first alternative, moving records for free space management changes rid; may not be acceptable.

### Index classification

- Primary vs. secondary: If search key contains primary key, then called primary index.
  - Unique index: Search key contains a candidate key.
- Clustered vs. unclustered: If order of data records is the same as, or `close to', order of data entries, then called clustered index.
  - A file can be clustered on at most one search key.
  - Cost of retrieving data records through index varies greatly based on whether index is clustered or not.

### Clustered vs. Unclustered Index



**CLUSTERED** 

**UNCLUSTERED** 

## Cost Model Analysis

- We ignore CPU costs, for simplicity:
  - B: The number of data pages (Blocks)
  - R: Number of records per page (Records)
  - D: (Average) time to read or write a single disk page
- Measuring number of page I/O's
  - ignores gains of pre-fetching a sequence of pages; thus, even
     I/O cost is only approximated
- Average-case analysis; based on several simplifying assumptions
- Operations to measure
  - Scan whole table
  - Equality search
  - Range selection
  - Insert a record
  - Delete a record

# Summary of workload

File Type	Scan	Equality Search	Range Search	Insert	Delete
Неар	BD	.5BD	BD	2D	Search + D
Sorted	BD	D log <sub>2</sub> B	$Dlog_2B + #$ matching p.	Search + BD	Search + BD
Clustered	1.5BD	D Log <sub>F</sub> 1.5B	DLog <sub>F</sub> 1.5B + # matched pages	Search + D	Search + D
Unclustered tree index	BD(R + 0.15)	D(1+ log <sub>F</sub> 0.15B)	D(Log <sub>F</sub> 0.15B + # matching records)	D(3 + log <sub>F</sub> 0.15B)	Search + 2D
Unclustered Hash index	BD(R + 0.125)	2D	BD	4D	Searches + 2D

### RAID Goals

- Disk Array: Arrangement of several disks that gives abstraction of a single, large disk
- Goals: Increase performance and reliability.
  - high capacity and high speed by using multiple disks in parallel
  - high reliability by storing data redundantly, so that data can be recovered even if a disk fails
- Two main techniques:
  - Data striping: Data is partitioned; size of a partition is called the striping unit. Partitions are distributed over several disks.
  - Redundancy: More disks -> more failures. Redundant information allows reconstruction of data if a disk fails.

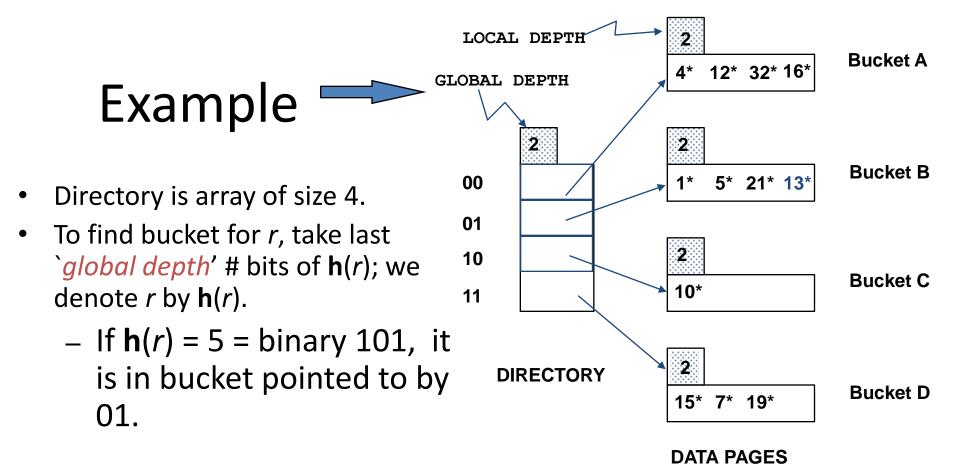
### Levels of Raid

- RAID Level 0: Block striping; non-redundant.
  - Used in high-performance applications where data lost is not critical.
- RAID Level 1: Mirrored disks with block striping
  - Offers best write performance.
  - Popular for applications such as storing log files in a database system.
- RAID Level 2: Memory-Style Error-Correcting-Codes (ECC) with bit striping.
- RAID Level 3: Bit-Interleaved Parity
  - a single parity bit is enough for error correction, not just detection
    - When writing data, corresponding parity bits must also be computed and written to a parity bit disk
    - To recover data in a damaged disk, compute XOR of bits from other disks (including parity bit disk)
- RAID Level 4: Block-Interleaved Parity; uses block-level striping, and keeps a
  parity block on a separate disk for corresponding blocks from N other disks.
- RAID Level 5: Block-Interleaved Distributed Parity; partitions data and parity among all N + 1 disks, rather than storing data in N disks and parity in 1 disk.
- RAID Level 6: P+Q Redundancy scheme; similar to Level 5, but stores extra redundant information to guard against multiple disk failures

### **INDEXES**

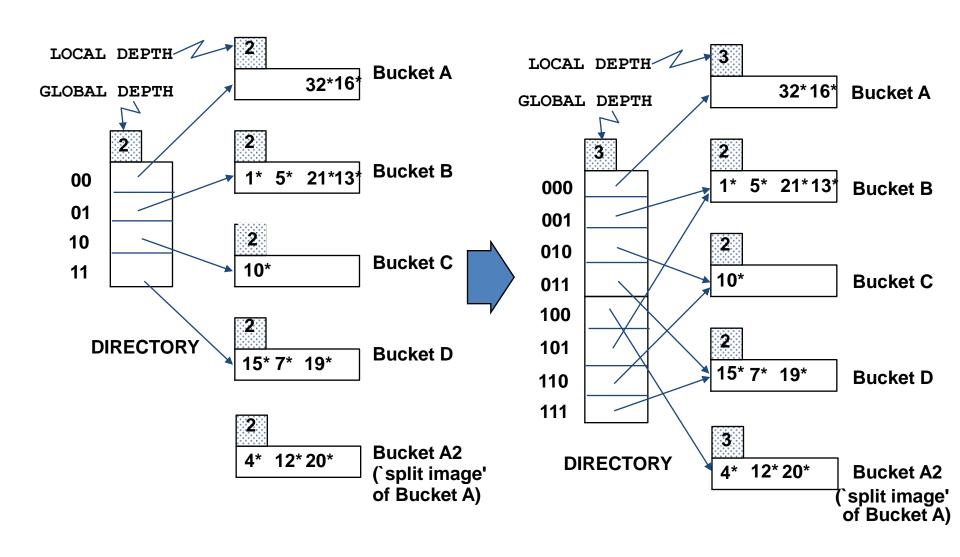
## **Extendible Hashing Algorithm**

- Situation: Hash Bucket (primary page) becomes full. Why not re-organize file by doubling # of buckets?
  - Reading and writing all pages is expensive!
  - Idea: Use <u>directory of pointers to buckets</u>, double # of buckets by <u>doubling the directory</u>, splitting just the bucket that overflowed!
  - Directory much smaller than file, so doubling it is much cheaper. Only one page of data entries is split. No overflow page!
  - Trick lies in how hash function is adjusted!



- **❖ Insert**: If bucket is full, **split** it (allocate new page, re-distribute).
- ❖ *If necessary*, double the directory. (As we will see, splitting a bucket does not always require doubling; we can tell by comparing *global depth* with *local depth* for the split bucket.)

# Insert h(r)=20 (Causes Doubling)



## Extendible hashing details

- 20 = binary 10100. Last **2** bits (00) tell us *r* belongs in A or A2. Last **3** bits needed to tell which.
  - Global depth of directory: Max # of bits needed to tell which bucket an entry belongs to.
  - Local depth of a bucket: # of bits used to determine if an entry belongs to this bucket.
- When does bucket split cause directory doubling?
  - Before insert, local depth of bucket = global depth. Insert causes local depth to become > global depth; directory is doubled by copying it over and `fixing' pointer to split image page. (Use of least significant bits enables efficient doubling via copying of directory!)

## Linear Hashing

- LH handles the problem of long overflow chains without using a directory, and handles duplicates.
- <u>Idea</u>: Use a family of hash functions h<sub>0</sub>, h<sub>1</sub>, h<sub>2</sub>, ...
  - $-\mathbf{h}_{i}(key) = \mathbf{h}(key) \mod(2^{i}N); N = initial # buckets$
  - h is some hash function (range is not 0 to N-1)
  - If N =  $2^{d0}$ , for some d0,  $\mathbf{h}_i$  consists of applying  $\mathbf{h}$  and looking at the last di bits, where di = d0 + i.
  - $\mathbf{h}_{i+1}$  doubles the range of  $\mathbf{h}_i$  (similar to directory doubling)

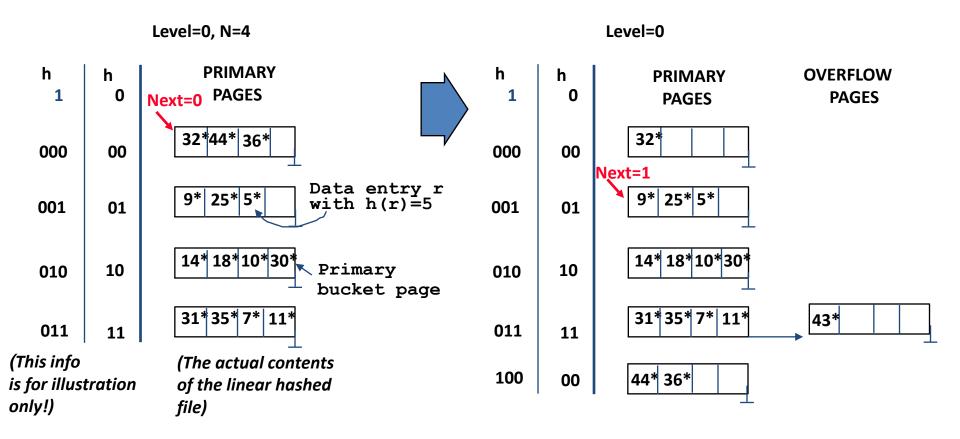
## Linear Hashing (Contd.)

- Directory avoided in LH by using overflow pages, and choosing bucket to split round-robin.
  - Splitting proceeds in `rounds'. Round ends when all N<sub>R</sub> initial (for round R) buckets are split. Buckets 0 to Next-1 have been split; Next to N<sub>R</sub> yet to be split.
  - Current round number is Level.
  - Search: To find bucket for data entry r, find  $h_{Level}(r)$ :
    - If  $\mathbf{h}_{level}(r)$  in range `Next to  $N_R'$ , r belongs here.
    - Else, r could belong to bucket  $\mathbf{h}_{Level}(r)$  or bucket  $\mathbf{h}_{Level}(r) + N_R$ ; must apply  $\mathbf{h}_{Ievel+1}(r)$  to find out.

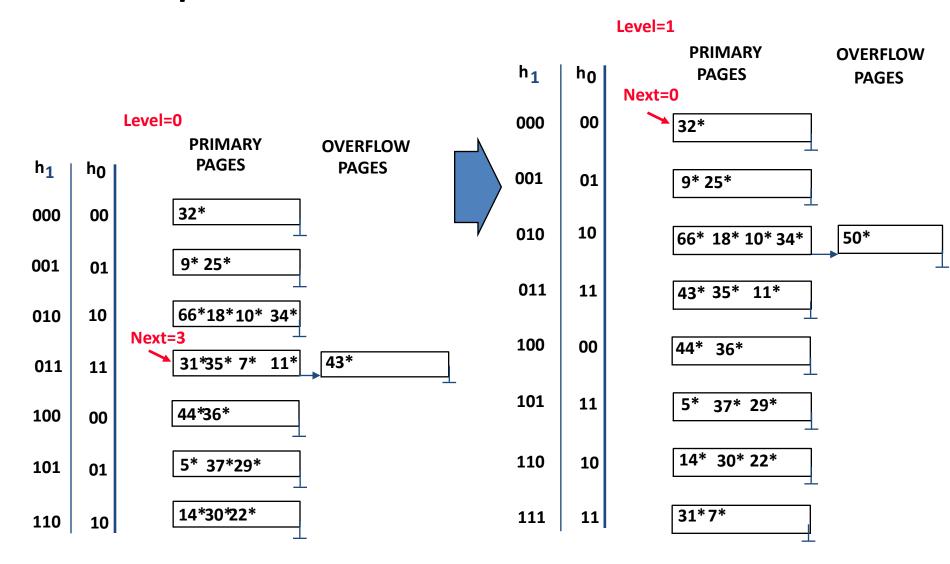
## **Example of Linear Hashing**

 On split, h<sub>Level+1</sub> is used to redistribute entries.

Insert record with h(key) = 43\*



## Example: End of a Round



## Summary: Hash-Based Indexes

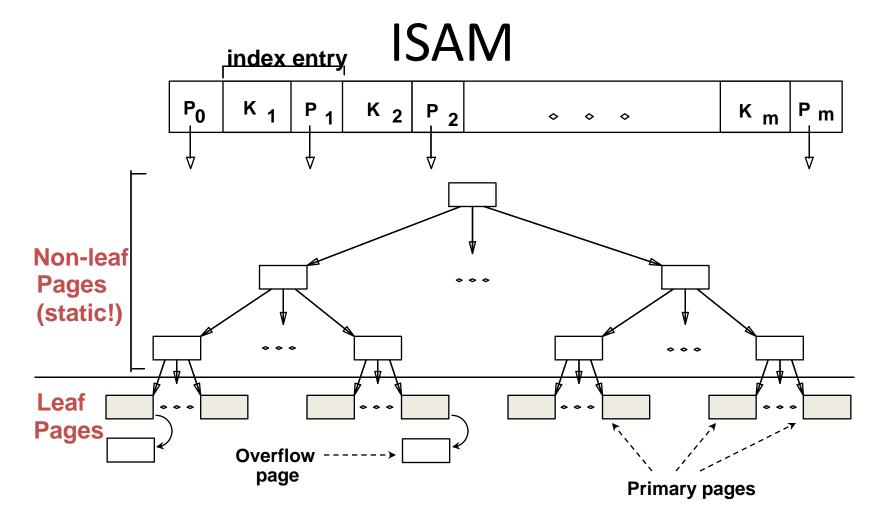
- Hash-based indexes: best for equality searches, cannot support range searches.
- Static Hashing can lead to long overflow chains.
- Extendible Hashing avoids overflow pages by splitting a full bucket when a new data entry is to be added to it. (*Duplicates may require overflow pages*.)
  - Directory to keep track of buckets, doubles periodically.
  - Can get large with skewed data; additional I/O if this does not fit in main memory.

## Summary: Linear hashing

- Linear Hashing avoids directory by splitting buckets round-robin, and using overflow pages.
  - Overflow pages not likely to be long.
  - Duplicates handled easily.
  - Space utilization could be lower than Extendible Hashing, since splits not concentrated on `dense' data areas.
    - Can tune criterion for triggering splits to trade-off slightly longer chains for better space utilization.
- For hash-based indexes, a skewed data distribution is one in which the hash values of data entries are not uniformly distributed!

### Tree Structured Indexes

- Tree-structured indexing techniques support both *range searches* and *equality searches*.
- Tree structures with search keys on valuebased domains
  - <u>ISAM</u>: static structure
  - <u>B+ tree</u>: dynamic, adjusts gracefully under inserts and deletes.



- Leaf pages contain sorted data records (e.g., Alt 1 index).
- Non-leaf part directs searches to the data records; static once built!
- Inserts/deletes: use overflow pages, bad for frequent inserts.

### Comments on ISAM

- Main problem
  - Long overflow chains after many inserts, high I/O cost for retrieval.
- Advantages
  - Simple when updates are rare.
  - Leaf pages are allocated in sequence, leading to sequential I/O.
  - Non-leaf pages are static; for concurrent access, no need to lock non-leaf pages
- Good performance for frequent updates?

B+tree!

### **B-tree Organization**

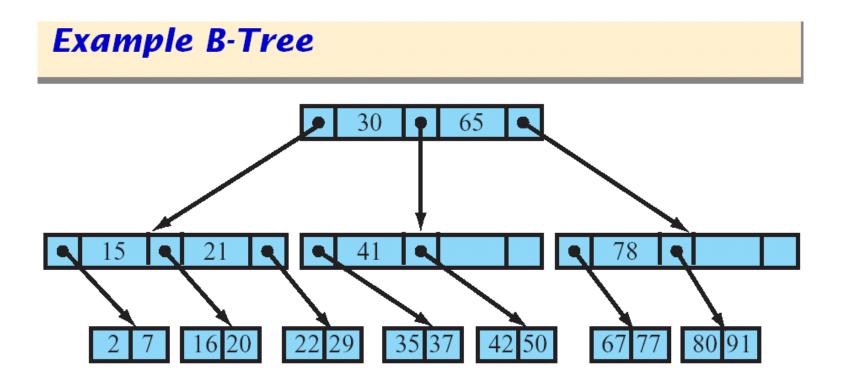
A B-tree helps minimize access to the index / directory

A B-tree is a tree where:

- Each node contains s slots for a index record and s + 1 pointers
- Each node is always at least ½ full

Order: the maximum number of keys in a non-leaf node

Fanout of a node x: the number of assigned pointers out of the node x

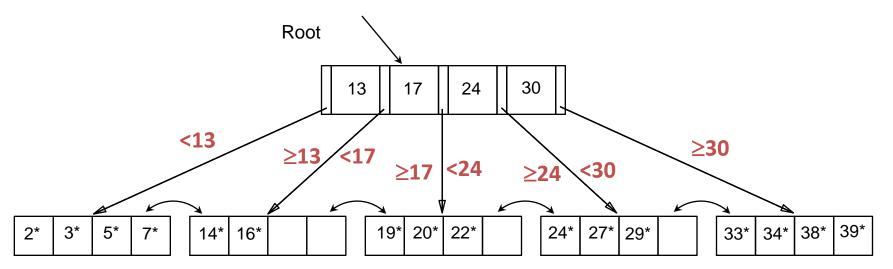


### Definition of B+ Tree

- A B-tree of order n is a height-balanced tree, where each node may have up to n children, and in which:
  - All leaves (leaf nodes) are on the same level
  - No node can contain more than n children
  - All nodes except the root have at least n/2 children
  - The root is either a leaf node, or it has at least n/2 children

#### Example B+ Tree

- Search begins at root, and key comparisons direct it to a leaf (as in ISAM).
- Search for 5\*, 15\*, all data entries >= 24\* ...



#### Inserting a Data Entry into a B+ Tree

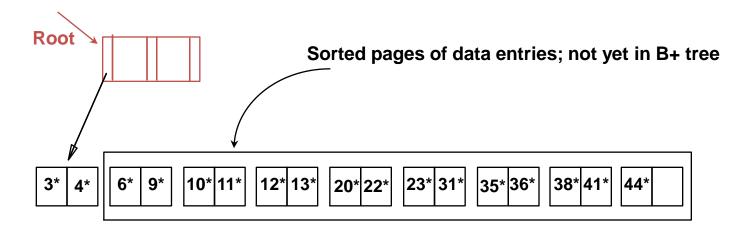
- Find correct leaf L.
- Put data entry onto L.
  - If L has enough space, done!
  - Else, must <u>split</u> L (into L and a new node L2)
    - Redistribute entries evenly, <u>copy up</u> middle key.
    - Insert index entry pointing to *L2* into parent of *L*.
- This can happen recursively
  - To split index node, redistribute entries evenly, but
     push up middle key. (Contrast with leaf splits.)
- Splits "grow" tree; root split increases height.
  - Tree growth: gets wider or one level taller at top.

#### Deleting a Data Entry from a B+ Tree

- Start at root, find leaf L where entry belongs.
- Remove the entry.
  - If L is at least half-full, done!
  - If L has only \[ \bar{n/2} \] 1 entries,
    - Try to <u>re-distribute</u>, borrowing from <u>sibling</u> (adjacent node with same parent as L).
    - If re-distribution fails, <u>merge</u> L and sibling.
- If merge occurred, must delete entry (pointing to L
   or sibling) from parent of L.
- Merge could propagate to root, decreasing height.

## **Bulk Loading Algorithm**

- Initialization:
  - Sort all data entries
  - Insert pointer to the first (leaf) page in a new (root) page.



## Bulk Loading Algorithm (Contd.)

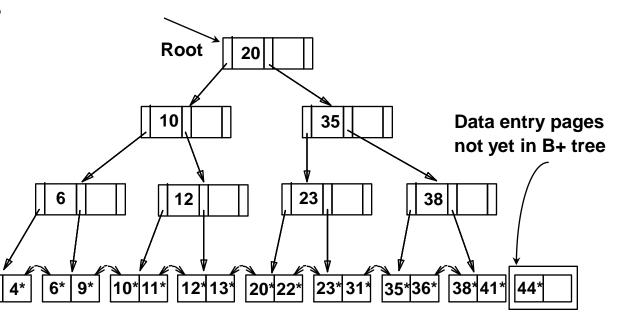
 Index entries for leaf pages always enter into r\*, right-most index page just above leaf level. Root 10 20

Data entry pages not yet in B+ tree

4\* 6\* 9\* 10\*11\* 12\*13\* 20\*22\* 23\*31\* 35\*36\* 38\*41\* 44\*

 When the r\* node fills up, it splits.

 Split may go up rightmost path to the root.



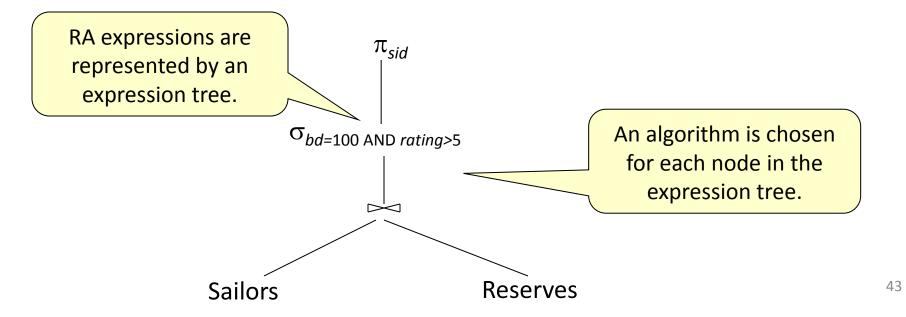
# QUERY EVALUATION AND QUERY OPTIMIZATION

#### Tree of relational operators

Sailors (*sid*: integer, *sname*: string, *rating*: integer, *age*: real) Reserves (*sid*: integer, *bid*: integer, *day*: date, *rname*: string)

SELECT sid
FROM Sailors NATURAL JOIN Reserves
WHERE bid = 100 AND rating > 5;

 $\pi_{sid}$  ( $\sigma_{bid=100 \text{ AND } rating>5}$  (Sailors  $\sim$  Reserves))



#### Approaches to Evaluation

- Algorithms for evaluating relational operators use some simple ideas extensively:
  - Indexing: Can use WHERE conditions to retrieve small set of tuples (selections, joins)
  - Iteration: Sometimes, faster to scan all tuples even if there is an index. (And sometimes, we can scan the data entries in an index instead of the table itself.)
  - Partitioning: By using sorting or hashing, we can partition the input tuples and replace an expensive operation by similar operations on smaller inputs.

#### Relational Operations

- Operators to implement:
  - Selection ( $\sigma$ ) Selects a subset of rows from relation.
  - Projection ( $\pi$ ) Deletes unwanted columns from relation.
  - <u>Join</u> ( $\triangleright \triangleleft$ ) Allows us to combine two relations.
  - <u>Set-difference</u> (— ) Tuples in reln. 1, but not in reln. 2.
  - <u>Union</u> (  $\cup$  ) Tuples in reln. 1 and in reln. 2.
  - Aggregation (SUM, MIN, etc.) and GROUP BY
  - Order By Returns tuples in specified order.
- Since each op returns a relation, ops can be composed.
   After we cover the operations, we will discuss how to optimize queries formed by composing them.

#### JOIN Algorithms

- Block Nested Loop Join
- Index Nested Loop
- Sort Merge Join

#### Project functionality other Algorithms

Influences sorting and hashing

## Select functionality

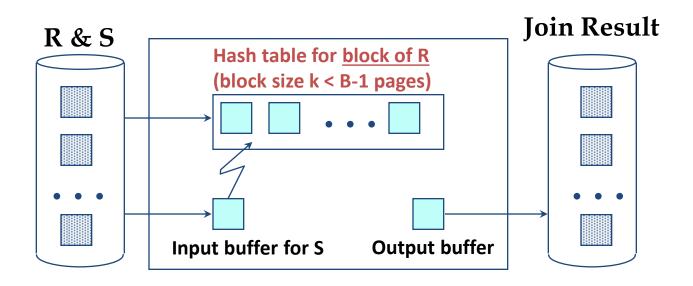
- General selection criteria
- Answering question via record ids

#### **Block Nested Loops Join**

- How can we utilize additional buffer pages?
  - If the smaller relation fits in memory, use it as outer, read the inner only once.
  - Otherwise, read a big chunk of it each time, resulting in reduced # times of reading the inner.
- Block Nested Loops Join:
  - Take the <u>smaller</u> relation, say R, as <u>outer</u>, the other as inner.
  - Buffer allocation: one buffer for scanning the inner S, one buffer for output, all remaining buffers for holding a `block'' of outer R.

#### Block Nested Loops Join Diagram

```
foreach block in R do
build a hash table on R-block
foreach S page
for each matching tuple r in R-block, s in S-page do
add <r, s> to result
```



#### **Examples of Block Nested Loops**

- Cost: Scan of outer table + #outer blocks \* scan of inner table
  - #outer blocks = \[ # pages of outer / block size \]
  - Given available buffer size B, block size is at most B-2.
- With Sailors (S) as outer, a block has 100 pages of S:
  - Cost of scanning S is 500 I/Os; a total of 5 blocks.
  - Per block of S, we scan Reserves; 5\*1000 I/Os.
  - Total = 500 + 5 \* 1000 = 5,500 I/Os.

#### Sailors:

- Each tuple is 50 bytes long,
- 80 tuples per page,
- 500 pages.

#### Reserves:

- Each tuple is 40 bytes long,
- 100 tuples per page,
- 1000 pages.

#### Index Nested Loops Join

```
foreach tuple r in R do
foreach tuple s in S where r_i == s_j do
add \langle r, s \rangle to result
```

- If there is an index on the join column of one relation (say S), can make it the <u>inner</u> and exploit the index.
  - Cost:  $M + ((M*p_R) * cost of finding matching S tuples)$
- For each R tuple, cost of probing S index is about 1.2 for hash index, 2-4 for B+ tree. Cost of then finding S tuples (assuming Alt. (2) or (3) for data entries) depends on clustering.
  - Clustered index: 1 I/O (typical).
  - Unclustered: up to 1 I/O per matching S tuple.

## Sort-Merge Join $(R \bowtie S)$

- Sort R and S on join column using external sorting.
- Merge R and S on join column, output result tuples.
   Repeat until either R or S is finished:
  - Scanning:
    - Advance scan of R until current R-tuple >=current S tuple,
    - Advance scan of S until current S-tuple>=current R tuple;
    - Do this until current R tuple = current S tuple.
  - Matching:
    - Match all R tuples and S tuples with same value; output <r, s> for all pairs of such tuples.
- Data access patterns for R and S?

#### Refinement of Sort-Merge Join

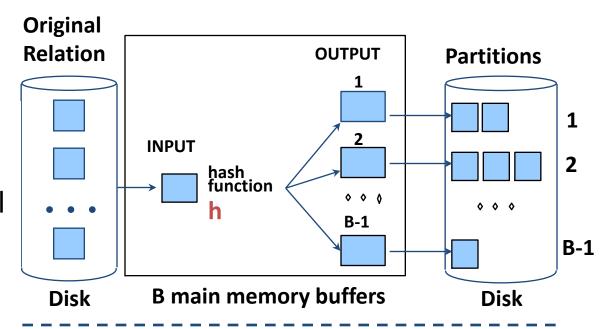
#### • <u>Idea</u>:

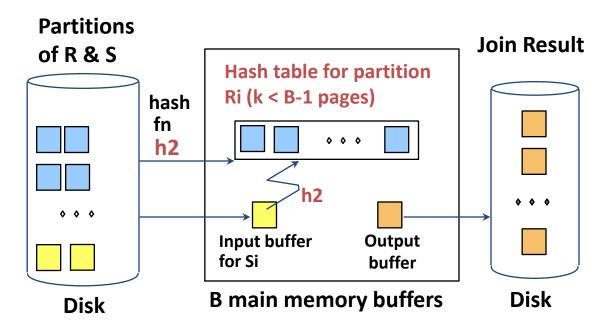
- Sorting of R and S has respective merging phases
- Join of R and S also has a merging phase
- Combine all these merging phases!
- Two-pass algorithm for sort-merge join:
  - Pass 0: sort subfiles of R, S individually
  - Pass 1: merge sorted runs of R, merge sorted runs of S, and merge the resulting R and S files as they are generated by checking the join condition.

#### **Hash Join**

 Partitioning: Partition both relations using hash fn h: Ri tuples will only match with Si tuples.

Probing: Read in partition i of R, build hash table on Ri using h2 (<> h!). Scan partition i of S, search for matches.





## Approach 1 to General Selections

- (1) Find the *most selective access path, retrieve* tuples using it, and (2) apply any remaining terms that don't match the index *on the fly*.
  - Most selective access path: An index or file scan that is expected to require the smallest # I/Os.
    - Terms that match this index reduce the number of tuples retrieved;
    - Other terms are used to discard some retrieved tuples, but do not affect I/O cost.
  - Consider day<8/9/94 AND bid=5 AND sid=3.</li>
    - A B+ tree index on *day* can be used; then, *bid=5* and *sid=3* must be checked for each retrieved tuple.
    - A hash index on <bid, sid> could be used; day<8/9/94 must then be checked on the fly.</li>

## Approach 2: **SELECT** Intersection of Rids

- If we have 2 or more matching indexes that use Alternatives (2) or (3) for data entries:
  - Get sets of rids of data records using each matching index.
  - Intersect these sets of rids.
  - Retrieve the records and apply any remaining terms.
  - Consider day<8/9/94 AND bid=5 AND sid=3. If we have a B+ tree index on day and an index on sid, both using</li>
     Alternative (2), we can:
    - retrieve rids of records satisfying day<8/9/94 using the first, rids of records satisfying sid=3 using the second,
    - intersect these rids,
    - retrieve records and check bid=5.

#### Projection Based on Sorting

- Modify Pass 0 of external sort to eliminate unwanted fields.
  - Runs of about 2B pages are produced,
  - But tuples in runs are smaller than input tuples. (Size ratio depends on # and size of fields that are dropped.)
- Modify merging passes to eliminate duplicates.
  - # result tuples smaller than input. Difference depends on # of duplicates.
- Cost: In Pass 0, read input relation (size M), write out same number of <u>smaller</u> tuples. In merging passes, <u>fewer</u> tuples written out in each pass.
  - Using Reserves example, 1000 input pages reduced to 250 in Pass 0 if size ratio is 0.25.

#### Projection Based on Hashing

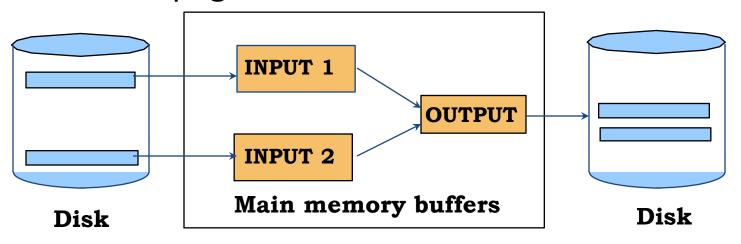
- <u>Partitioning phase</u>: Read R using one input buffer. For each tuple, discard unwanted fields, apply hash function h1 to choose one of B-1 output buffers.
  - Result is B-1 partitions (of tuples with no unwanted fields). 2 tuples from different partitions guaranteed to be distinct.
- <u>Duplicate elimination phase</u>: For each partition, read it and build an in-memory hash table, using hash fn h2 (<> h1) on all fields, while discarding duplicates.
  - If partition does not fit in memory, can apply hash-based projection algorithm recursively to this partition.
- Cost: For partitioning, read R, write out each tuple, but with fewer fields. This is read in next phase.

#### **EXTERNAL SORT**

## 2-Way Sort: Requires 3 Buffers

- Pass 1: Read a page, sort it, write it.
  - only one buffer page is used
- Pass 2, 3, ..., etc.:
  - three buffer pages used.

Pass determines Size of partition

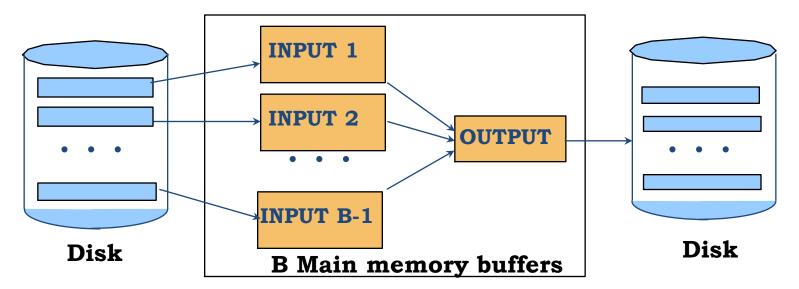


Partition data

#### General External Merge Sort

#### More than 3 buffer pages. How can we utilize them?

- To sort a file with N pages using B buffer pages:
  - Pass 0: use B buffer pages. Produce [N/B] sorted runs of B pages each.
  - Pass 2, 3..., etc.: merge *B-1* runs.



## Cost of External Merge Sort

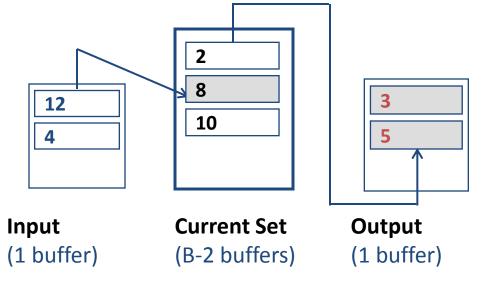
❖ E.g., with 5 (B) buffer pages, sort 108 (N) page file:

Pass 0	$\lceil 108/5 \rceil$ = 22 sorted runs of 5 pages each (last run is only 3 pages)	N/B sorted runs of B pages each
Pass 1	$\lceil 22/4 \rceil = 6$ sorted runs of 20 pages each (last run is only 8 pages)	N/B / (B-1) sorted runs of B(B-1) pages each
Pass 2	2 sorted runs, 80 pages and 28 pages	$\lceil N/B \rceil / (B-1)^2$ sorted runs of B(B-1) <sup>2</sup> pages
Pass 3	Sorted file of 108 pages	$\lceil N/B \rceil / (B-1)^3$ sorted runs of B(B-1) <sup>3</sup> ( $\geq N$ ) pages

Number of passes = 1 + \[ \log\_{B-1} \[ \log\_{B-1} \] \]
 Cost = 2N \* (# of passes)

## Replacement Sort

- Organize B available buffers:
  - 1 buffer for *input*
  - B-2 buffers for current set
  - 1 buffer for output

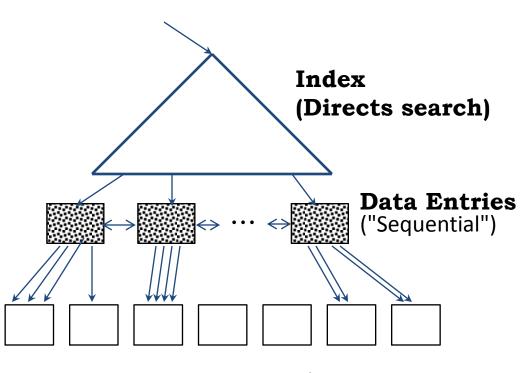


- ❖ Pick tuple r in the current set with the *smallest value that is* ≥ *largest value in output*, e.g. 8, to extend the current run.
- Fill the space in current set by adding tuples from input.
- Write output buffer out if full, extending the current run.
- **Current run terminates** if every tuple in the current set is smaller than the largest tuple in output.

#### Clustered B+ Tree Used for Sorting

 Cost: root to the left-most leaf, then retrieve all leaf pages (Alternative 1)

If Alternative 2 is used?
 Additional cost of retrieving data records: each page fetched just once.



**Data Records** 

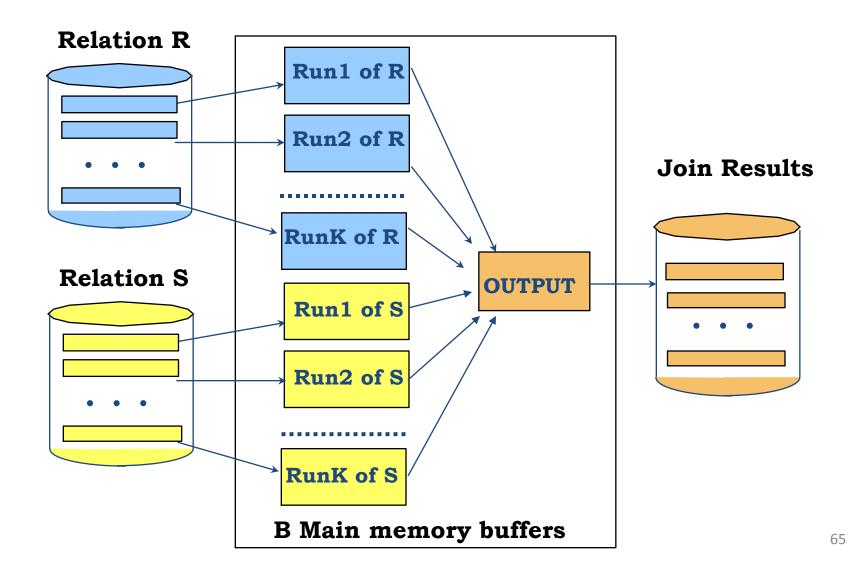
Almost always better than external sorting!

#### Refinement of Sort-Merge Join

#### • <u>Idea</u>:

- Sorting of R and S has respective merging phases
- Join of R and S also has a merging phase
- Combine all these merging phases!
- Two-pass algorithm for sort-merge join:
  - Pass 0: sort subfiles of R, S individually
  - Pass 1: merge sorted runs of R, merge sorted runs of S, and merge the resulting R and S files as they are generated by checking the join condition.

#### 2-Pass Sort-Merge Algorithm



#### Using an Index for Selections

- Cost depends on # qualifying tuples, and <u>clustering</u>.
  - Cost of finding data entries (often small) + cost of retrieving records (could be large w/o clustering).
  - For gpa > 3.0, if 10% of tuples qualify (100 pages, 10,000 tuples), cost  $\approx$  100 I/Os with a clustered index; otherwise, up to 10,000 I/Os!
- Important refinement for unclustered indexes:
  - 1. Find qualifying data entries.
  - 2. Sort the rid's of the data records to be retrieved.
  - 3. Fetch rids in order.

Each data page is looked at just once, although # of such pages likely to be higher than with clustering.

## Approach 1 to General Selections

- (1) Find the *most selective access path, retrieve* tuples using it, and (2) apply any remaining terms that don't match the index *on the fly*.
  - Most selective access path: An index or file scan that is expected to require the smallest # I/Os.
    - Terms that match this index reduce the number of tuples retrieved;
    - Other terms are used to discard some retrieved tuples, but do not affect I/O cost.
  - Consider day<8/9/94 AND bid=5 AND sid=3.</li>
    - A B+ tree index on *day* can be used; then, *bid=5* and *sid=3* must be checked for each retrieved tuple.
    - A hash index on <bid, sid> could be used; day<8/9/94 must then be checked on the fly.</li>

#### Approach 2: Intersection of Rids

- If we have 2 or more matching indexes that use Alternatives (2) or (3) for data entries:
  - Get sets of rids of data records using each matching index.
  - Intersect these sets of rids.
  - Retrieve the records and apply any remaining terms.
  - Consider day<8/9/94 AND bid=5 AND sid=3. If we have a B+ tree index on day and an index on sid, both using</li>
     Alternative (2), we can:
    - retrieve rids of records satisfying day<8/9/94 using the first, rids of records satisfying sid=3 using the second,
    - intersect these rids,
    - retrieve records and check bid=5.

#### Summary: Query plan

- Many implementation techniques for each operator; no universally superior technique for most operators.
- Must consider available alternatives for each operation in a query and choose best one based on:
  - system state (e.g., memory) and
  - statistics (table size, # tuples matching value k).
- This is part of the broader task of optimizing a query composed of several ops.

#### Representation of a SQL Command

```
SELECT {DISTINCT} < list of columns>
FROM < list of relations>
{WHERE < list of "Boolean Factors">}
{GROUP BY < list of columns>
{HAVING < list of Boolean Factors>}}
{ORDER BY < list of columns>};
```

#### Query Semantics:

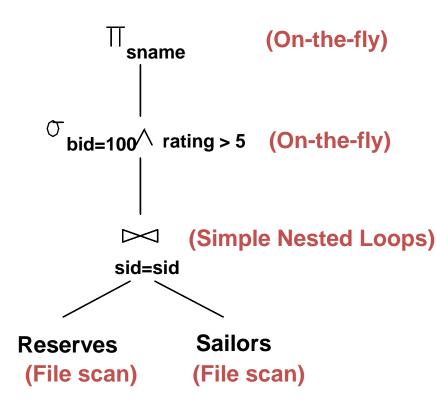
- 1. Take Cartesian product (a.k.a. cross-product) of relns in FROM, projecting only to those columns that appear in other clauses
- 2. If a WHERE clause exists, apply all filters in it
- 3. If a GROUP BY clause exists, form groups on the result
- 4. If a HAVING clause exists, filter groups with it
- 5. If an ORDER BY clause exists, make sure output is in the right order
- 6. If there is a DISTINCT modifier, remove duplicates

## System Catalog

- System information: buffer pool size and page size.
- For each relation:
  - relation name, file name, file structure (e.g., heap file)
  - attribute name and type of each attribute
  - index name of each index on the relation
  - integrity constraints...
- For each index:
  - index name and structure (B+ tree)
  - search key attribute(s)
- For each view:
  - view name and definition
- Statistics about each relation (R) and index (I):

#### Query Evaluation Plan

- Query evaluation plan is an extended RA tree, with additional annotations:
  - access method for each relation;
  - implementation method for each relational operator.
- Cost Approximation
- Manipulating plans:
  - Relational Alebra Equivalence
  - Push selections below the join.
  - Materialization: store a temporary relation T,
  - if the subsequent join needs to scan T multiple times.
    - The opposite is pipelining



#### Query Blocks: Units of Optimization

 An SQL query is parsed into a collection of query blocks, and these are optimized one block at a time.

```
SELECT S.sname
FROM Sailors S
WHERE S.age IN
(SELECT MAX (S2.age)
FROM Sailors S2
GROUP BY S2.rating)
```

Outer block

Nested block

\* Nested blocks are usually treated as calls to a subroutine, made once per outer tuple.

#### Cost Estimation for Multi-relation Plans

SELECT attribute list FROM relation list WHERE term1 AND ... AND termk

- Consider a query block:
- Reduction factor (RF) is associated with each term.
- Max number tuples in result = the product of the cardinalities of relations in the FROM clause.
- Result cardinality = max # tuples \* product of all RF's.
- Multi-relation plans are built up by joining one new relation at a time.
  - Cost of join method, plus estimate of join cardinality gives us both cost estimate and result size estimate.

#### **Query Optimization: Summary**

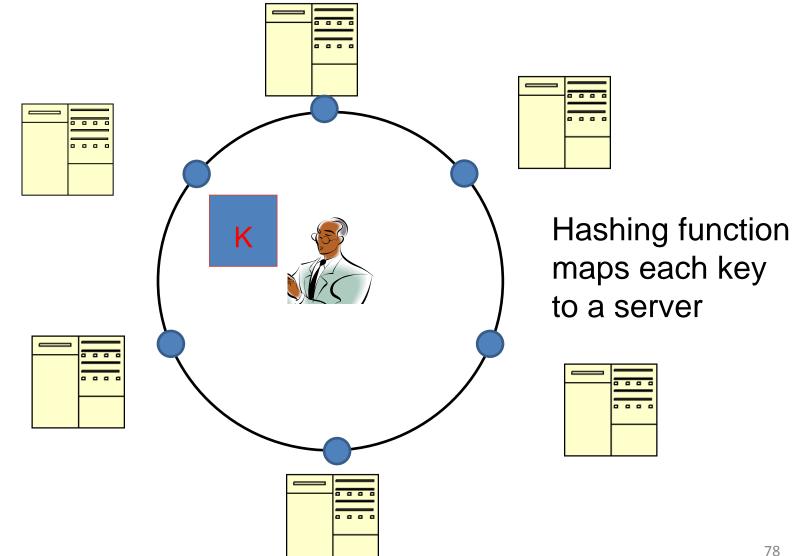
- Two parts to optimizing a query:
  - Consider a set of alternative plans.
    - Must prune search space; typically, left-deep plans only.
  - Must estimate cost of each plan that is considered.
    - Must estimate size of result and cost for each plan node.
    - Key issues: Statistics, indexes, operator implementations.

#### **Query Optimization: Summary**

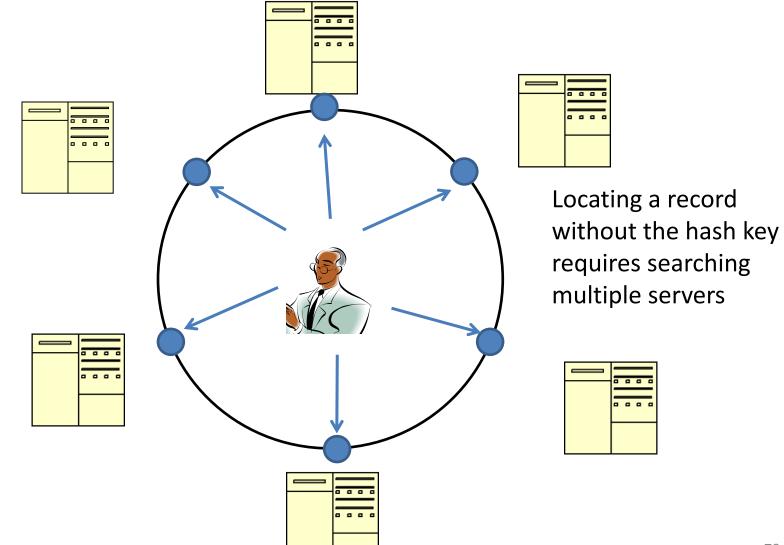
- Single-relation queries:
  - All access paths considered, cheapest is chosen.
  - Issues: Selections that match index, whether index key has all needed fields and/or provides tuples in a desired order.
- Multiple-relation queries:
  - All single-relation plans are first enumerated.
    - Selections/projections considered as early as possible.
  - Next, for each 1-relation plan, all ways of joining another relation (as inner) are considered.
  - Next, for each 2-relation plan that is `retained', all ways of joining another relation (as inner) are considered, etc.
  - At each level, for each subset of relations, only best plan for each interesting order of tuples is `retained'.

# **NO SQL**

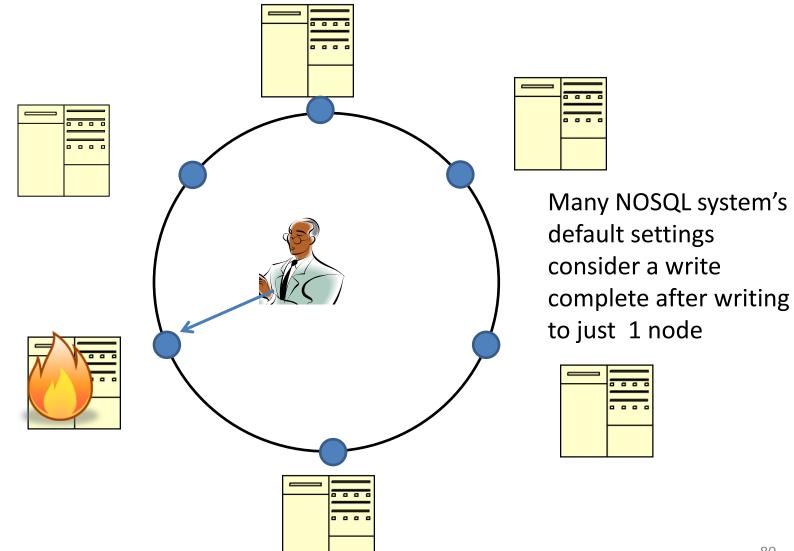
# Typical NoSQL architecture



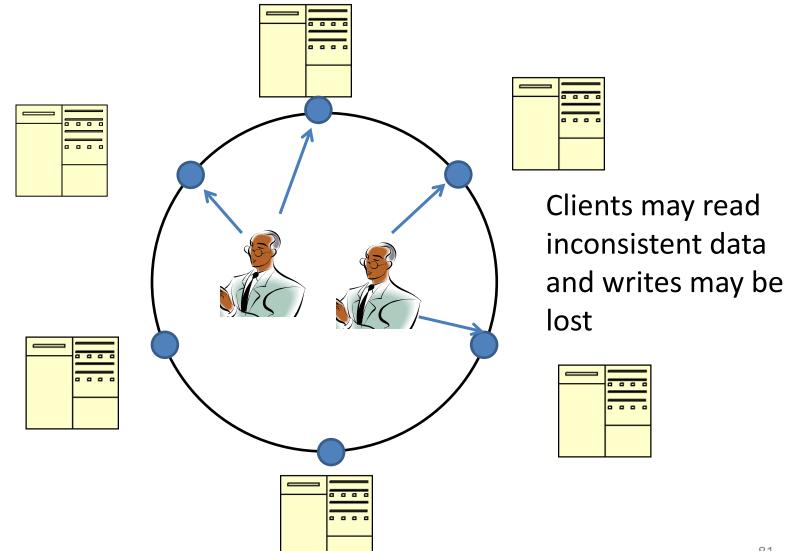
#### The search problem: No Hash key



# The Fault Tolerance problem



# The consistency problem



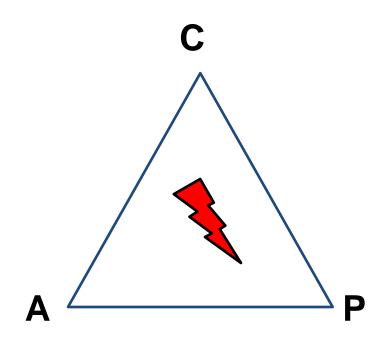
# Theory of NOSQL: CAP

#### **GIVEN:**

- Many nodes
- Nodes contain replicas of partitions of the data

#### Consistency

- all replicas contain the same version of data
- Availability
  - system remains operational on failing nodes
- Partition tolarence
  - multiple entry points
  - system remains operational on system split

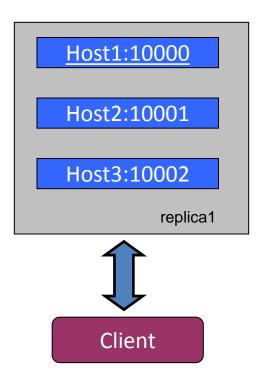


CAP Theorem: satisfying all three at the same time is impossible

#### Replica Sets

- Redundancy and Failover
- Zero downtime for upgrades and mainentance

- Master-slave replication
  - Strong Consistency
  - Delayed Consistency
- Geospatial features





#### How does it vary from SQL?

- Looser schema definition
- Various schema models
  - Key value pair
  - Document oriented
  - Graph
  - Column based
- Applications written to deal with specific documents
  - Applications aware of the schema definition as opposed to the data
- Designed to handle distributed, large databases
- Trade off: ad hoc queries for speed and growth of database

#### ACID - BASE

**A**tomicity

**C**onsistency

Isolation

**D**urability



Available (CP)

Soft-state

Eventually consistent (Asynchronous propagation)



Pritchett, D.: BASE: An Acid Alternative (queue.acm.org/detail.cfm?id=1394128)

# What is MapReduce?

 Programming model for expressing distributed computations on massive amounts of data
 AND

 An execution framework for large-scale data processing on clusters of commodity servers

#### **Programming Model**

- Transforms set of input key-value pairs to set of output key-value pairs
  - Map function written by user
  - Map:  $(k1, v1) \rightarrow list (k2, v2)$
  - MapReduce library groups all intermediate pairs with same key together
- Reduce written by user
  - Reduce:  $(k2, list (v2)) \rightarrow list (v2)$
  - Usually zero or one output value per group
  - Intermediate values supplied via iterator (to handle lists that do not fit in memory)

#### **Execution Framework**

- Handles scheduling of the tasks
  - Assigns workers to maps and reduce tasks
  - Handles data distribution
    - Moves the process to the data
  - Handles synchronization
    - Gathers, sorts and shuffles intermediate data
  - Handles faults
    - Detects worker failures and restarts
  - Understands the distributed file system

#### MongoDB Basics

- A MongoDB instance may have zero or more databases
- A database may have zero or more 'collections'.
- A collection may have zero or more 'documents'.
- A document may have one or more 'fields'.
- MongoDB 'Indexes' function much like their RDBMS counterparts.

#### RDB Concepts to NO SQL

RDBMS		MongoDB
Database	$\Rightarrow$	Database
Table, View	$\Rightarrow \Rightarrow \Rightarrow$	Collection
Row	$\Rightarrow$	Document (JSON, BSON)
Column		Field
Index		Index
Join		Embedded Document
Foreign Key		Reference
Partition	$\Rightarrow$	Shard

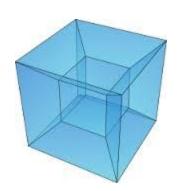
Collection is not strict about what it Stores

Schema-less

Hierarchy is evident in the design

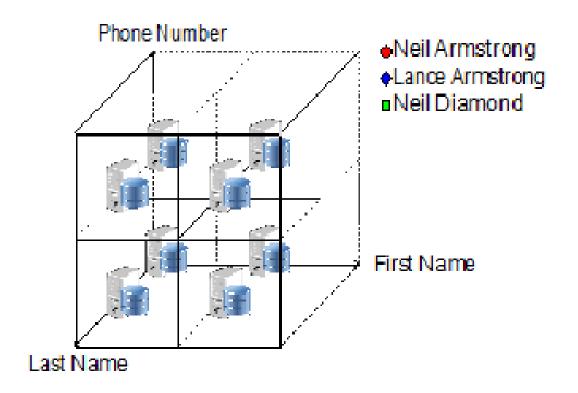
**Embedded Document?** 

#### HyperDex Key Points



- Maps records to a Hypercube Space
  - object's key are stored in a dedicated one-dimensional subspace for efficient lookup
  - only need to contact the servers which match the regions of the hyperspace assigned for the search attributes
- Value-dependent chaining
  - Keeps replicas consistent without heavy overhead from coordination of servers
    - Uses the hypercube space
  - Appoints a point leader that contains the most recent update of a record
    - Other replicas are updated from the point leader

# Each server is responsible for a region of the hyperspace



#### That's it

- Go over the lecture notes
- Read the book
- Go over homework 3
  - final exam questions will not be as difficult as homework problems
- Ask questions in piazza or via email
- Organize a study sheet
- Complete the example mid-term
- Practice problems

#### Summary: RAID Levels

- Level 0: No redundancy
- Level 1: Mirrored (two identical copies)
  - Each disk has a mirror image (check disk)
  - Parallel reads, a write involves two disks.
  - Maximum transfer rate = transfer rate of one disk
- Level 0+1: Striping and Mirroring
  - Parallel reads, a write involves two disks.
  - Maximum transfer rate = aggregate bandwidth

#### Summary: RAID Levels (Contd.)

- Level 3: Bit-Interleaved Parity
  - Striping Unit: One bit. One check disk.
  - Each read and write request involves all disks; disk array can process one request at a time.
- Level 4: Block-Interleaved Parity
  - Striping Unit: One disk block. One check disk.
  - Parallel reads possible for small requests, large requests can utilize full bandwidth
  - Writes involve modified block and check disk
- Level 5: Block-Interleaved Distributed Parity
  - Similar to RAID Level 4, but parity blocks are distributed over all disks