

CS-300: Data-Intensive Systems

Storage, Files, and Indexing

(Chapters 13.1-13.4 14.1 14.2)

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The big picture



**Want to
store data**

Conceptual
Design

ER
Models

ER to
Relational

Relational
Model

Logical
Design

Physical
Design

Relational
Algebra, SQL

SQL

Result

Query Optimization
and Execution

Relational Operators

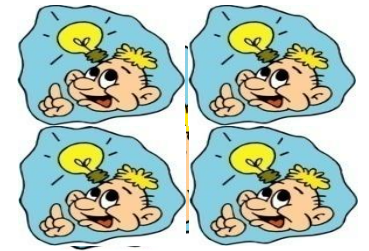
Access Methods

Buffer Management

Disk Space Management

Database
Storage

**Disk Storage,
Files**



Want to access data

File and access layer

Database as a “file of records”

- The database is stored as a collection of *files*
- Files are maintained by the underlying OS
- Operations:
 - Create/delete files
 - Insert/delete/modify record
 - Retrieve one particular record (*point access*) Specified using *record id*
 - Retrieve range of records (*range access*) Satisfying some conditions
 - Retrieve all records (*scan*)

File and access methods layer

- **File Organization**

- How is data organized in files?

- **Indexing**

- How to make data access efficient?

- **Storage**

- How is data physically stored on disk?

File organization and indexing

- File Organization
- Heap & Sorted Files
- Indexing
- Meta-data
 - System Catalog

File organization

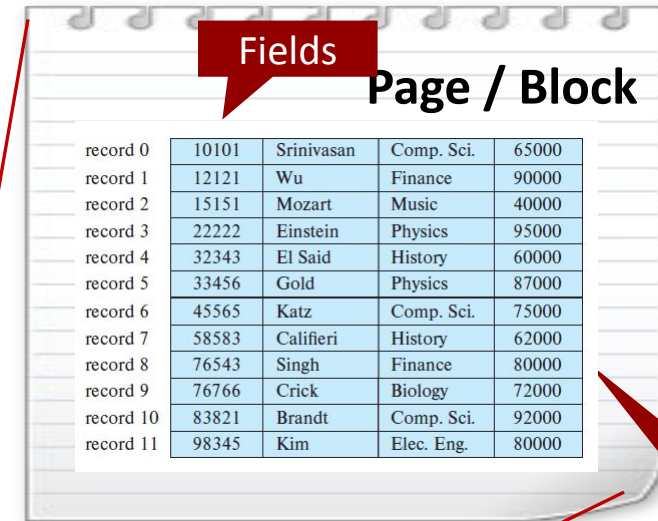
instructor

ID	name	dept_name	salary
22222	Einstein	Physics	95000
12121	Wu	Finance	90000
32343	El Said	History	60000
45565	Katz	Comp. Sci.	75000
98345	Kim	Elec. Eng.	80000
76766	Crick	Biology	72000
10101	Srinivasan	Comp. Sci.	65000
58583	Califieri	History	62000
83821	Brandt	Comp. Sci.	92000
15151	Mozart	Music	40000
33456	Gold	Physics	87000
76543	Singh	Finance	80000

Each file is made of pages

Each page is made of *records*

A record is a sequence of fields

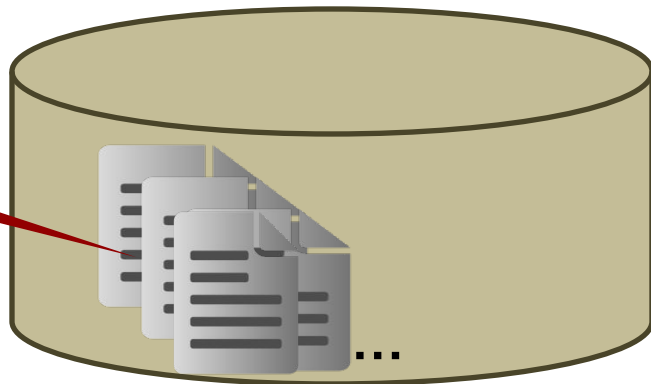


The diagram shows a page or block containing a table of records. A red callout box labeled 'Fields' points to the columns of the table. The table has four columns: ID, name, dept_name, and salary. The rows are labeled 'record 0' through 'record 11'.

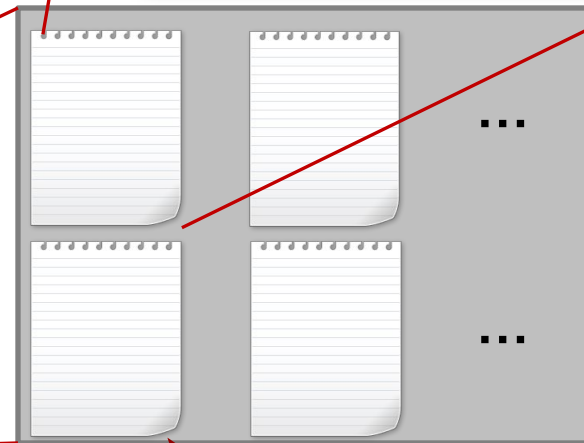
	ID	name	dept_name	salary
record 0	10101	Srinivasan	Comp. Sci.	65000
record 1	12121	Wu	Finance	90000
record 2	15151	Mozart	Music	40000
record 3	22222	Einstein	Physics	95000
record 4	32343	El Said	History	60000
record 5	33456	Gold	Physics	87000
record 6	45565	Katz	Comp. Sci.	75000
record 7	58583	Califieri	History	62000
record 8	76543	Singh	Finance	80000
record 9	76766	Crick	Biology	72000
record 10	83821	Brandt	Comp. Sci.	92000
record 11	98345	Kim	Elec. Eng.	80000

Records

Files



Storage



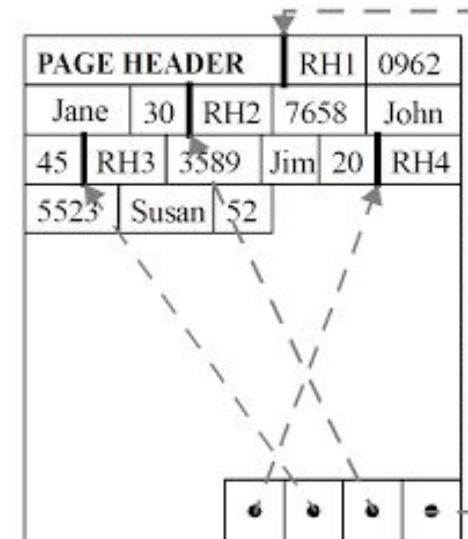
File

Pages / Block

Page format (N-ary storage model)

- Nowadays: Row store
- Page = collection of slots
- Each slot stores one record
 - Record identifier: <page_id, slot_number>
 - Option 2: <uniq> -> <page_id, slot_number>
- Page format should support
 - Fast searching, insertion, deletion
- *Page format* depends on record format
 - **Fixed-Length**
 - **Variable-Length**

RH1	0962	Jane	30
RH2	7658	John	45
RH3	3589	Jim	20
RH4	5523	Susan	52

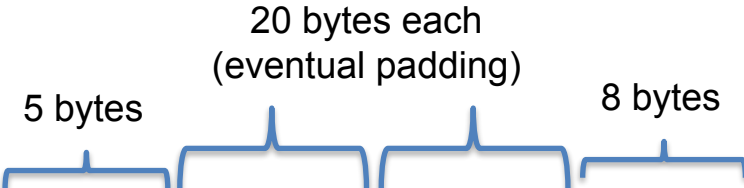


Record formats: fixed length

- Schema is stored in **system catalog**
 - Number of fields is fixed for all records of a table
 - Domain is fixed for all records of a table
- Each field has fixed length
- Finding i^{th} field is done via arithmetic

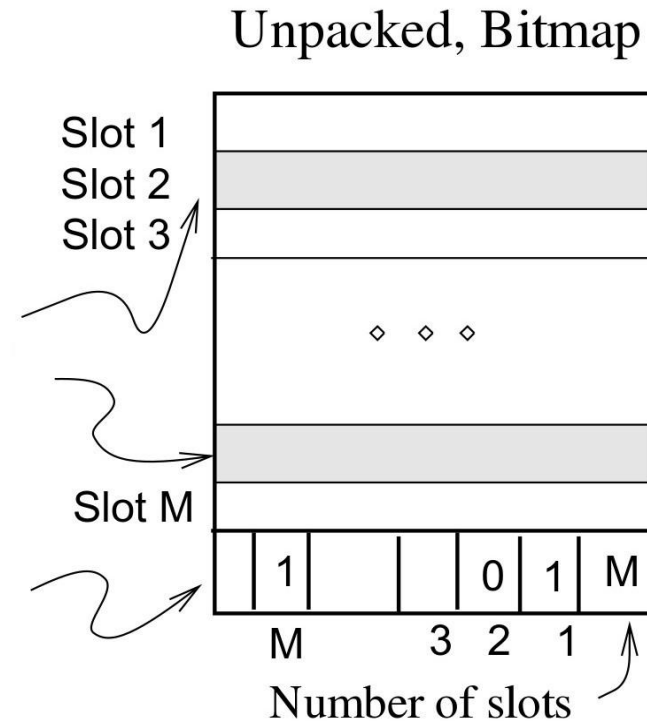
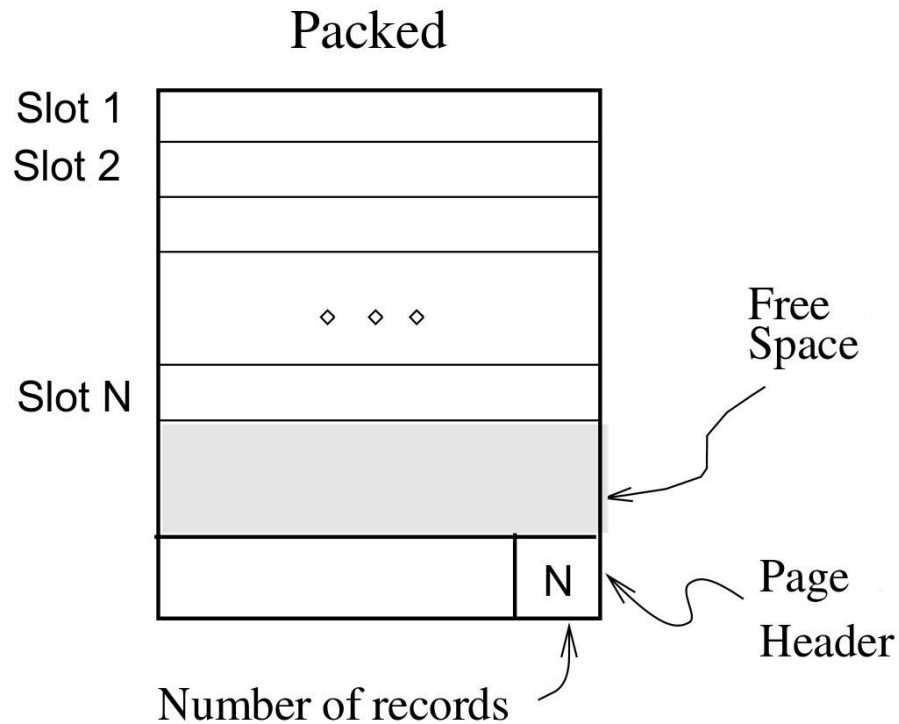
Simple: 53 bytes each!

```
type instructor = record
    ID varchar (5);
    name varchar(20);
    dept_name varchar (20);
    salary numeric (8,2);
end
```



record 0	10101	Srinivasan	Comp. Sci.	65000
record 1	12121	Wu	Finance	90000
record 2	15151	Mozart	Music	40000
record 3	22222	Einstein	Physics	95000
record 4	32343	El Said	History	60000
record 5	33456	Gold	Physics	87000
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record 10	83821	Brandt	Comp. Sci.	92000
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Page format: fixed-length records

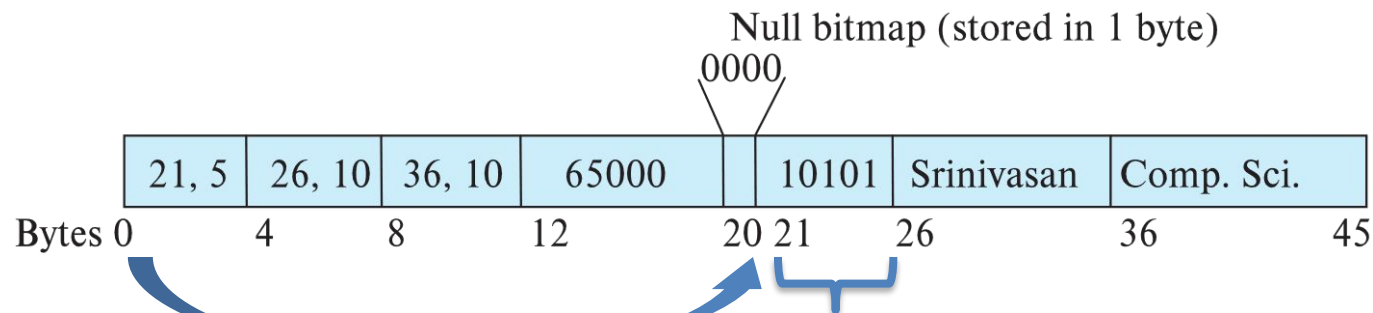


- Record id = $\langle \text{page id}, \text{slot \#} \rangle$
- In the *packed* case, moving records for free space management changes *rid* (maybe unacceptable)

Variable-Length Records

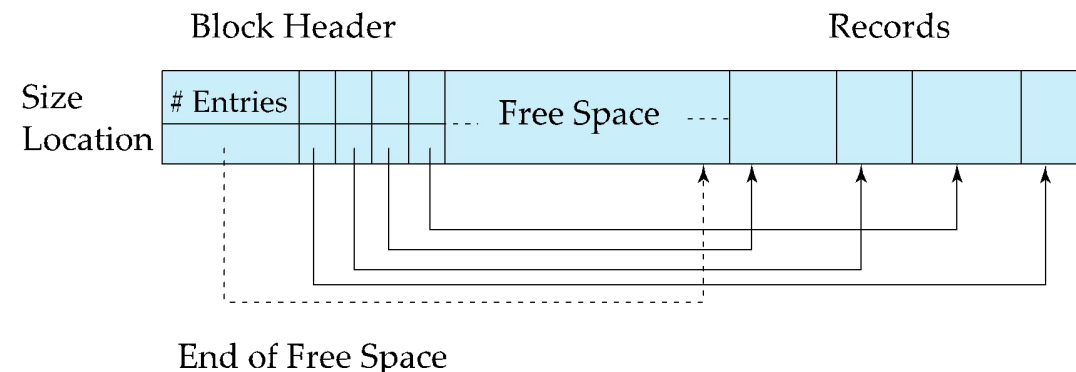
- Variable-length records arise in database systems in several ways:
 - Storage of multiple record types in a file
 - Record types that allow variable lengths for one or more fields such as strings (**varchar**)
- Attributes are stored in order
- Variable length attributes represented by fixed size (offset, length), with actual data stored after all fixed length attributes
- Null values represented by null-value bitmap

<i>ID</i>	<i>name</i>	<i>dept_name</i>	<i>salary</i>
10101	Srinivasan	Comp. Sci.	65000



Variable-Length Records: Slotted Page Structure

- **Slotted page** header contains:
 - number of record entries
 - end of free space in the block
 - location and size of each record
- Records can be moved around within a page to keep them contiguous with no empty space between them



Variable-length records: Issues

- If a field grows and no longer fits?
 - Shift all subsequent fields
- If record no longer fits in page?
 - Move a record to another page after modification
- What if record size > page size?
 - SQL Server record size = 8KB
 - DB2 record size = page size

Row store (N-ary storage model): Summary

Advantages

- Fast inserts, updates, and deletes.
- Good for queries that need the entire tuple (OLTP)
- Can use index-oriented physical storage for clustering.

Disadvantages

- Not good for scanning large portions of the table and/or a subset of the attributes
- Not ideal for compression because of multiple value domains within a single page

	Col A	Col B	Col C
Row #0	a0	b0	c0
Row #1	a1	b1	c1
Row #2	a2	b2	c2
Row #3	a3	b3	c3
Row #4	a4	b4	c4
Row #5	a5	b5	c5

What about storing an entire column contiguously in a block of data?

Decomposition Storage Model (DSM)

	Col A	Col B	Col C
Row #0	a0	b0	c0
Row #1	a1	b1	c1
Row #2	a2	b2	c2
Row #3	a3	b3	c3
Row #4	a4	b4	c4
Row #5	a5	b5	c5

Columnar Representation

- Benefits:
 - Reduced IO if only some attributes are accessed
 - Improved CPU cache performance
 - Improved compression
 - **Vector processing** on modern CPU architectures
- Drawbacks
 - Cost of tuple reconstruction from columnar representation
 - Cost of tuple deletion and update
 - Cost of decompression
- Columnar representation found to be more efficient for decision support than row-oriented representation
- Traditional row-oriented representation preferable for transaction processing
- Some databases support both representations
 - Called **hybrid row/column stores**

10101
12121
15151
22222
32343
33456
45565
58583
76543
76766
83821
98345

Srinivasan
Wu
Mozart
Einstein
El Said
Gold
Katz
Califieri
Singh
Crick
Brandt
Kim

Comp. Sci.
Finance
Music
Physics
History
Physics
Comp. Sci.
History
Finance
Biology
Comp. Sci.
Elec. Eng.

65000
90000
40000
95000
60000
87000
75000
62000
80000
72000
92000
80000

Partition Attributes Across (PAX)

Horizontally partition rows into groups

Then vertically partition their attributes into columns

Global header contains directory with the offsets to the file's row groups

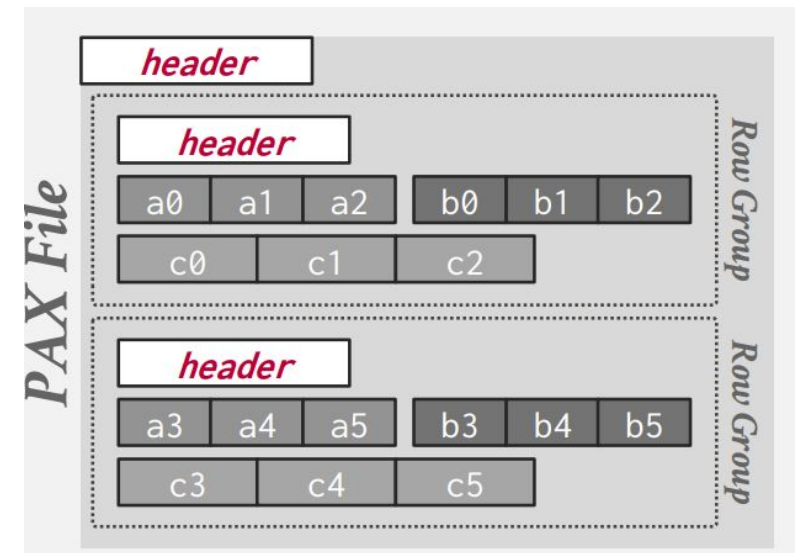
Each row group contains its own meta-data header about its contents

VLDB 2001 paper by Ailamaki et al.

First adopted by Oracle 9i

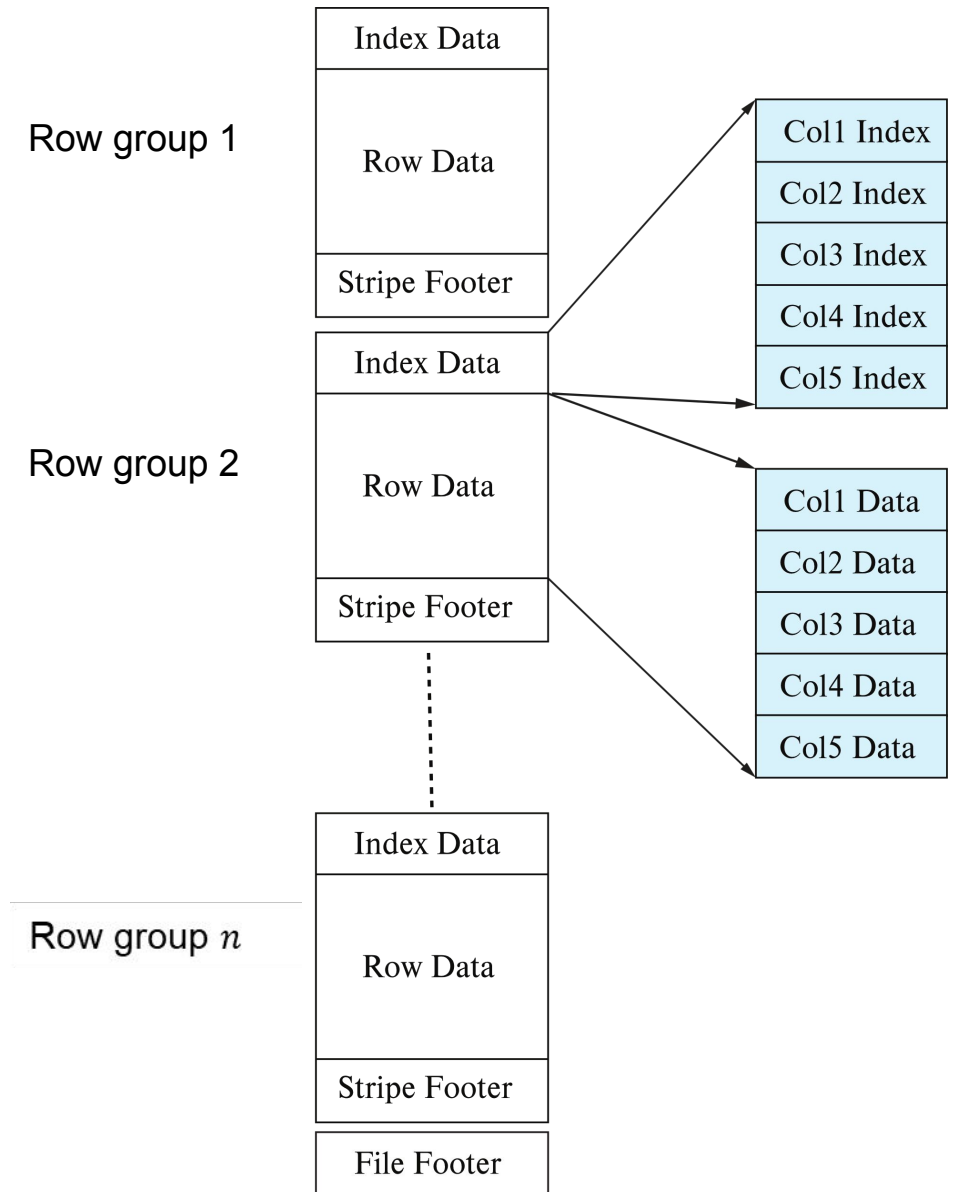
Now used at Google, Snowflake, Microsoft, etc.

	Col A	Col B	Col C
Row #0	a0	b0	c0
Row #1	a1	b1	c1
Row #2	a2	b2	c2
Row #3	a3	b3	c3
Row #4	a4	b4	c4
Row #5	a5	b5	c5



File Representation based on PAX

- Optimized Row Columnar (ORC) and Parquet: file formats with columnar storage inside file
- Very popular for big-data applications
- ORC file format shown on right:



File organization and indexing

- File Organization
- Heap & Sorted Files
- Indexing
- Meta-data
 - System Catalog

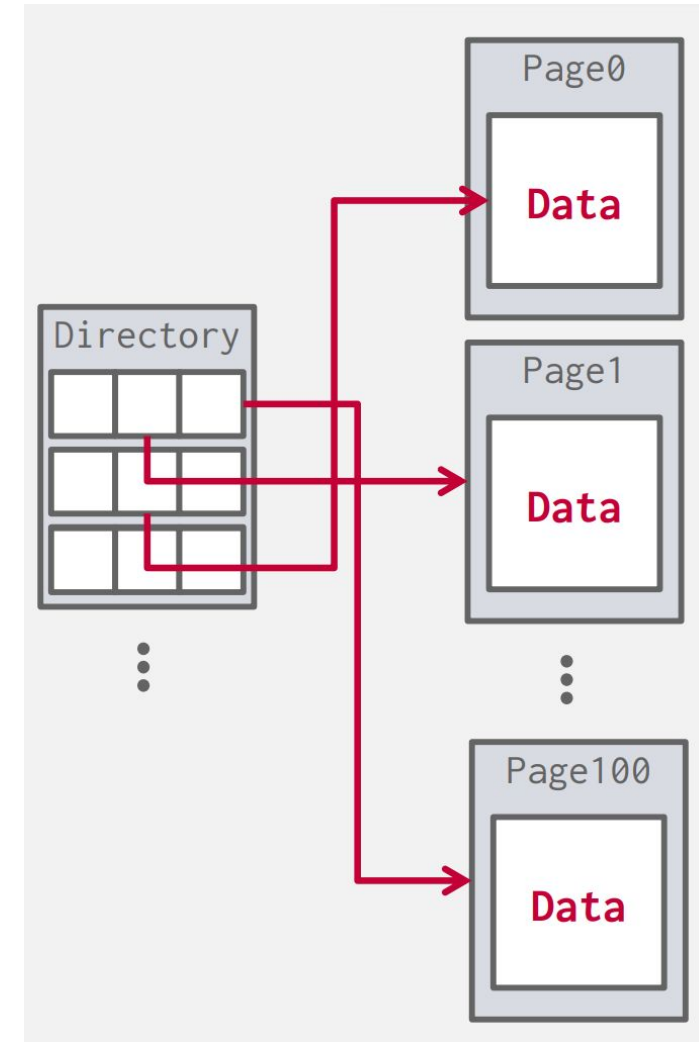
Alternative file organizations

Many alternatives exist, *each good for some situations, and not so good in others:*

- Heap files: Suitable when typical access is a file scan retrieving all records
- Sorted (Sequential) Files: Best for retrieval in some order, or for retrieving a *range* of records
- Index File Organizations: (will cover shortly..)

Heap (unordered) File Organization

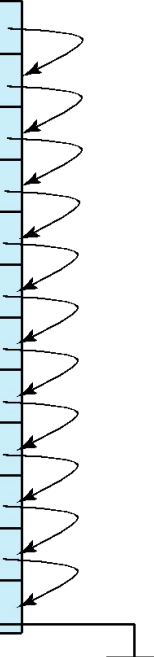
- Simplest file structure
 - Contains records in no particular order
 - Need to be able to scan, search based on rid
- The DBMS can locate a page on disk given by using
 1. Linked List: Header page holds pointers to a list of free pages and a list of data pages
 2. Page Directory: DBMS maintains special pages that track locations of data pages along with the amount of free space on each page
- As file grows and shrinks, disk pages are allocated and de-allocated
 - Need to manage free space



Sorted (Sequential) File Organization

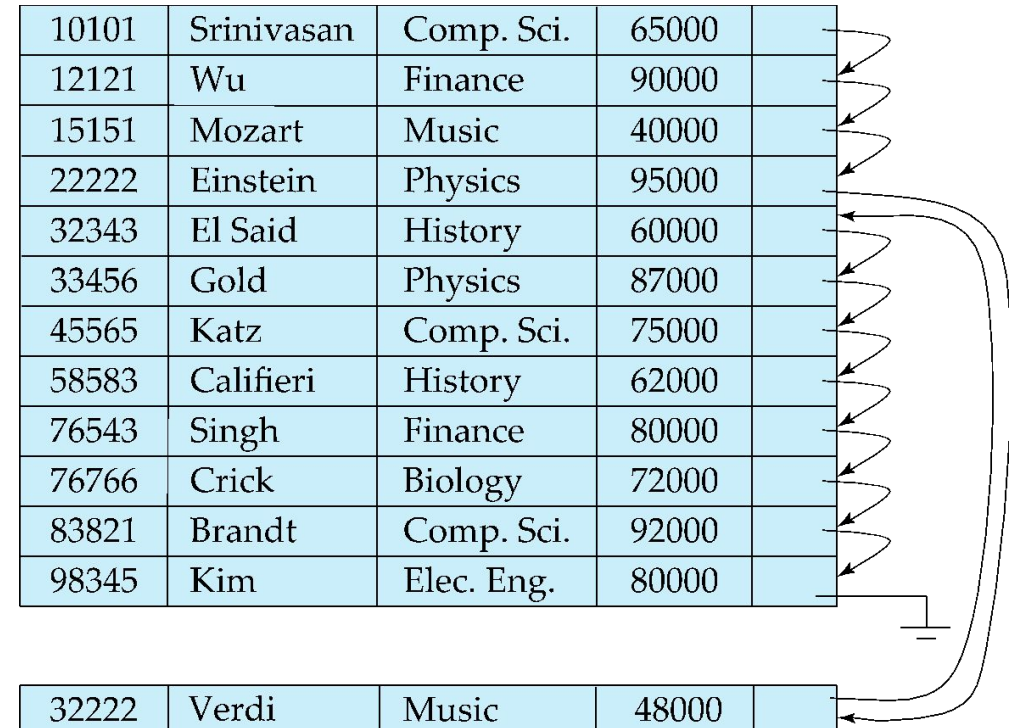
- Suitable for applications that require sequential processing of the entire file
- The records in the file are ordered by a **search-key**

10101	Srinivasan	Comp. Sci.	65000	
12121	Wu	Finance	90000	
15151	Mozart	Music	40000	
22222	Einstein	Physics	95000	
32343	El Said	History	60000	
33456	Gold	Physics	87000	
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83821	Brandt	Comp. Sci.	92000	
98345	Kim	Elec. Eng.	80000	



Sequential File Organization (Cont.)

- Deletion – use pointer chains
- Insertion – locate the position where the record is to be inserted
 - if there is free space insert there
 - if no free space, insert the record in an **overflow block**
 - In either case, pointer chain must be updated
- Need to reorganize the file from time to time to restore sequential order



Heap file vs. sorted file

- Which is better?
 - Let us design a cost model to find out
- Simplified cost model:
 - Based only on IO cost
 - IO is the dominating cost
 - Ignore CPU and other overheads
 - Ignore effect of prefetching and sequential access
 - Consider only average case

More assumptions...

- Single record insert and delete
- Equality search: exactly one match (e.g., search on key)
 - Question: what if more or fewer?
- Heap Files:
 - Insert always appends at the end of the file
- Sorted Files:
 - Files compacted after deletions
 - Search done on file-ordering attribute

Cost of operations (in # of I/O's)

B: Number of data pages

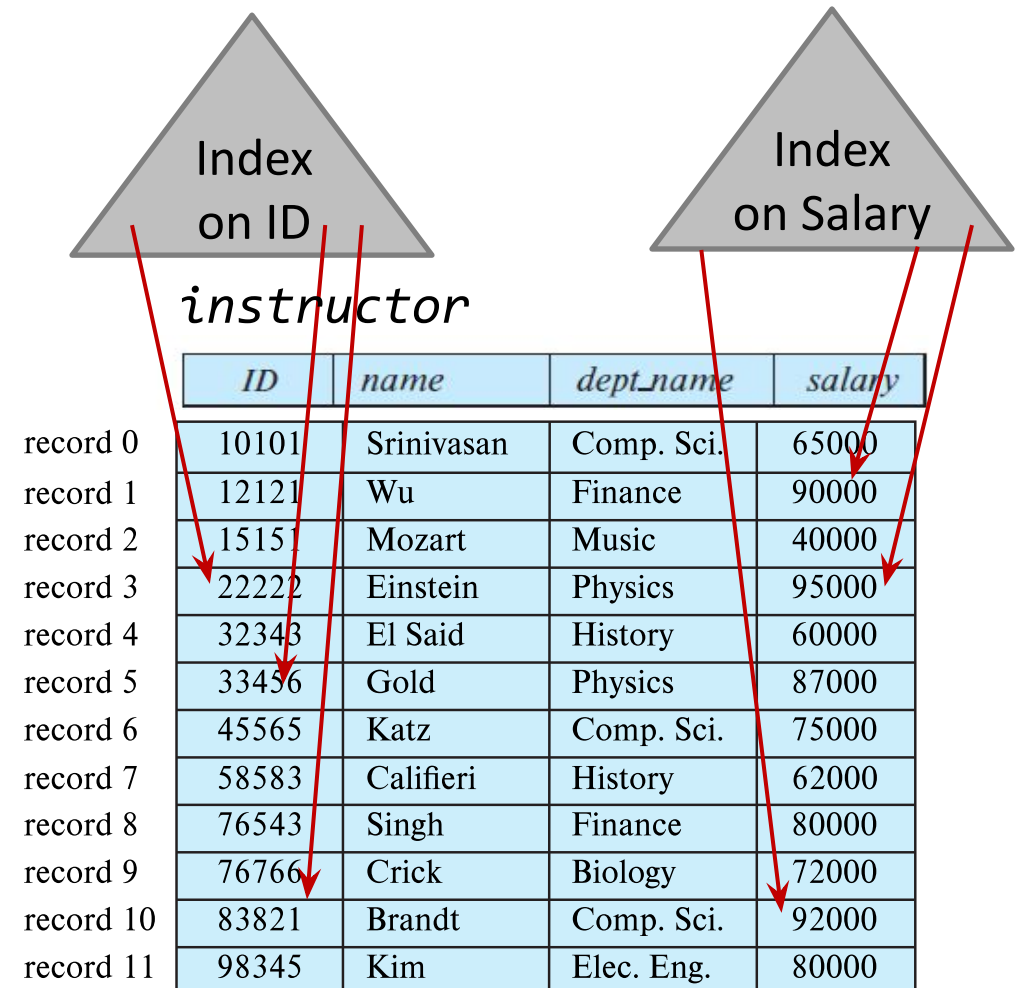
	Heap File	Sorted File	notes...
Scan all records	B	B	
Equality Search	$0.5B$	$\log_2 B$	assumes exactly one match!
Range Search	B	$(\log_2 B) + (\text{\#match pages})$	
Insert	2	$(\log_2 B) + 2*(B/2)$	must R & W
Delete	$0.5B + 1$	$(\log_2 B) + 2*(B/2)$	must R & W

File indexing and organization

- File Organization
- Heap & Sorted Files
- Indexing (entire lecture 5 will be about indexing)
- Meta-data
 - System Catalog

Indexing

- Instructor with ID = 22222?
- Instructor with ID = 33456?
- Instructor with ID = 83821?
- Updates?
- Salary \geq 90K?
- Indexing
 - Multiple efficient access paths



Sorted File on ID

Indexing

- Sometimes, we want to retrieve records by specifying the *values in one or more fields*, e.g.,
 - Find all students in the "CS" department
 - Find all students with a gpa > 3
- An **index** on a file speeds up selections on the *search key fields* for the index
 - The *search key* is **NOT** necessarily a *key* (e.g., no need to be unique)
- Index and keys
 - Any subset of the fields in a relation can be the search key for an index on the relation
 - Can have multiple indices on any number of fields

Index search conditions

- Search condition =
<search key, comparison operator>

Examples...

(1) Condition: Department = "CS"

- Search key: Department
- Comparison operator: equality (=)

(2) Condition: GPA > 3

- Search key: GPA
- Comparison operator: greater-than (>)

File organization and indexing

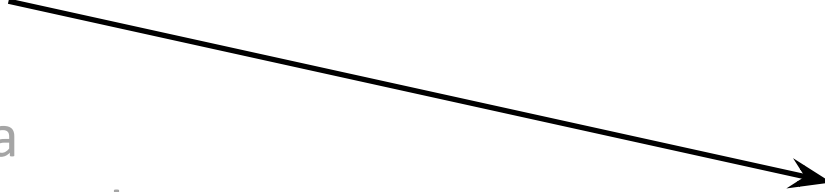
- File Organization

- Heap & Sorted Files

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- System Catalog



- Index Classification

- Clustered/Unclustered

- Sparse/Dense

- Types of Indexes

- Primary

- Clustering

- Secondary Key

- Secondary Non-Key

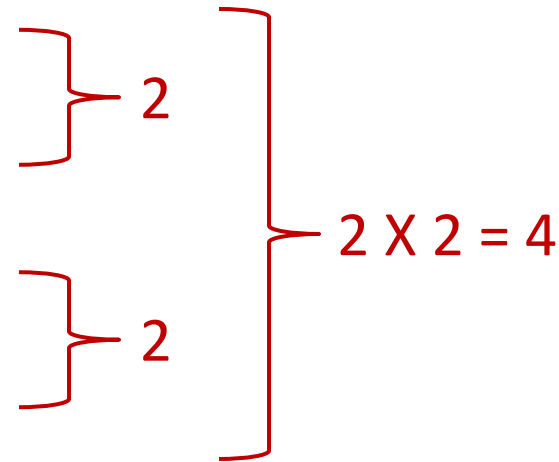
- Indexing techniques

- Hash vs tree

- Choosing search key

Index classification

- Clustered vs Unclustered
- Dense vs Sparse
- Indexing field
 - Key
 - Non-Key
- Physical ordering of the file
 - Ordered on indexing field
 - Not ordered on indexing field



		Physical Ordering on Indexing Field	
		Ordered	Not Ordered
Indexing Field	Key	Primary Index	Secondary Index (Key)
	Non Key	Clustering Index	Secondary Index (Non Key)

File organization and indexing

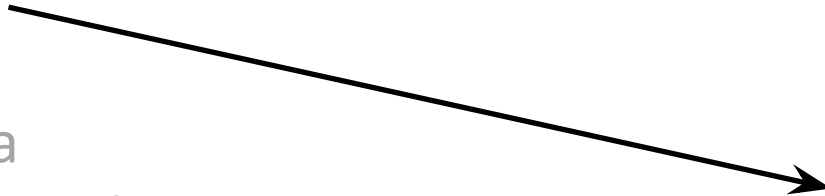
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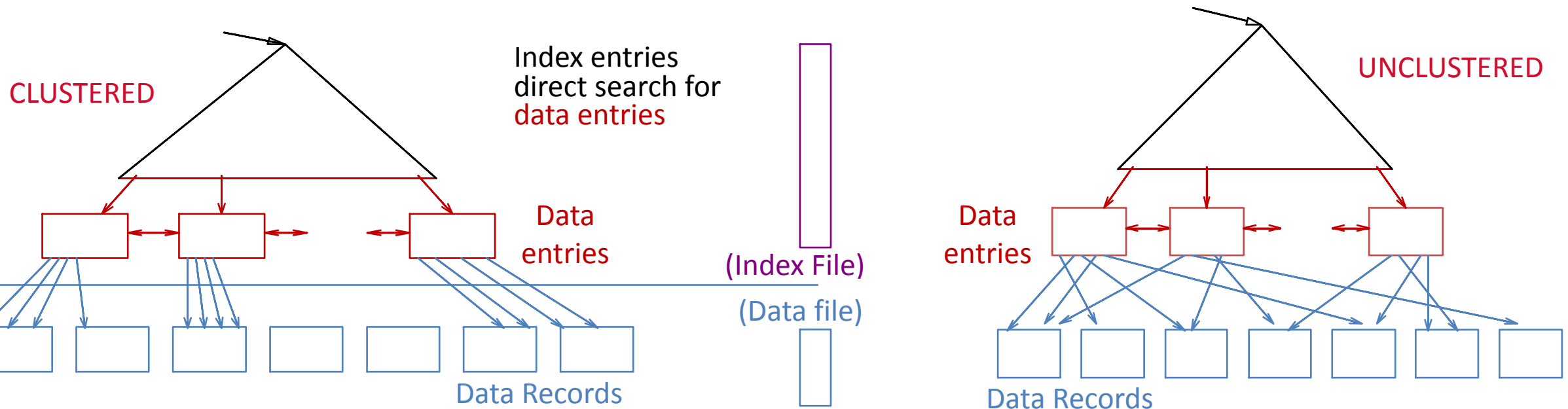
- Indexing techniques

- Hash vs tree

- Choosing search key

Index classification: Clustering

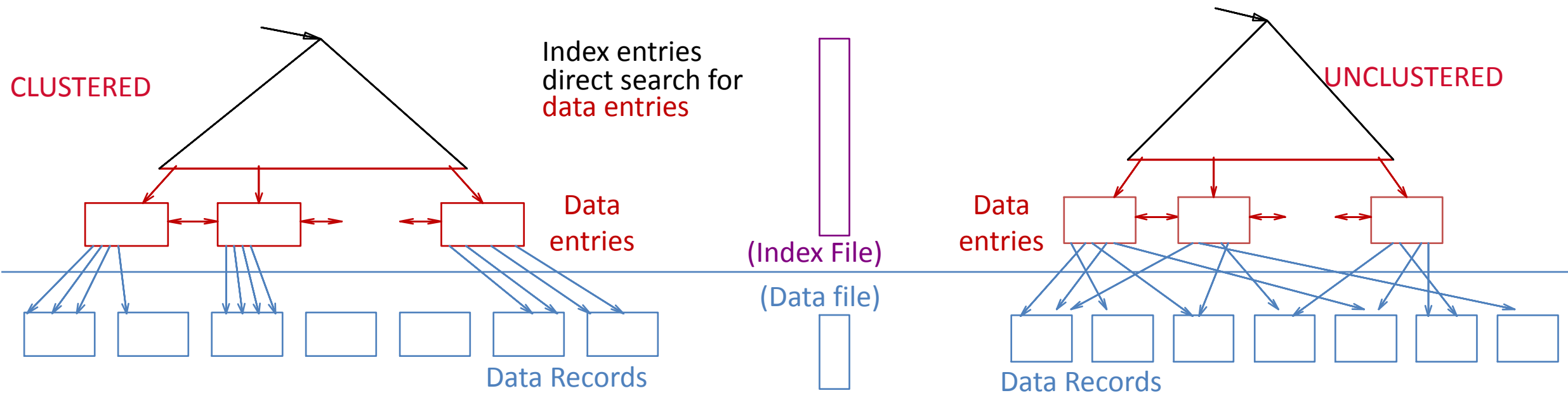
- **Clustered vs. unclustered:** If the order of the **data records** is similar to the order of the **index data entries**, then the index is **clustered**



Clustered vs unclustered index

Assuming Alternative 2 for data entries and data records stored in a Heap file:

- To build clustered index, first sort the Heap file
 - Keeping some free space on each page for future inserts
- Overflow pages may be needed for inserts
 - The order of data records is similar—but not identical to—the sort order



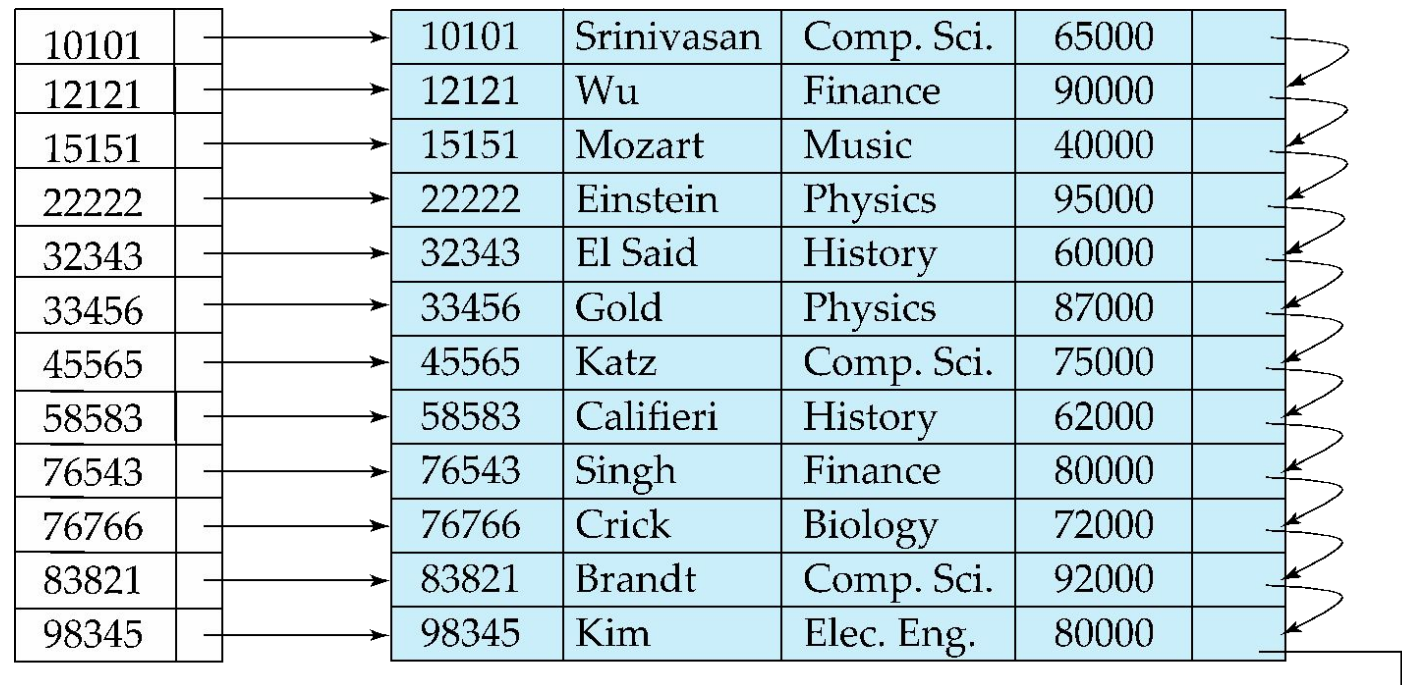
Clustered vs unclustered index

- Cost of retrieving records found in range scan:
 - Clustered: cost = # pages in file w/matching records
 - Unclustered: cost \approx # of matching index data entries
- What are the tradeoffs?
 - Clustered Pros:
 - Efficient for range searches
 - Clustered Cons:
 - Expensive to maintain (on the fly or sloppy with reorganization)

Dense Index Files

- **Dense index** — Index record appears for every search-key value in the file.
- E.g. index on *ID* attribute of *instructor* relation

10101		→	10101	Srinivasan	Comp. Sci.	65000	
12121		→	12121	Wu	Finance	90000	
15151		→	15151	Mozart	Music	40000	
22222		→	22222	Einstein	Physics	95000	
32343		→	32343	El Said	History	60000	
33456		→	33456	Gold	Physics	87000	
45565		→	45565	Katz	Comp. Sci.	75000	
58583		→	58583	Califieri	History	62000	
76543		→	76543	Singh	Finance	80000	
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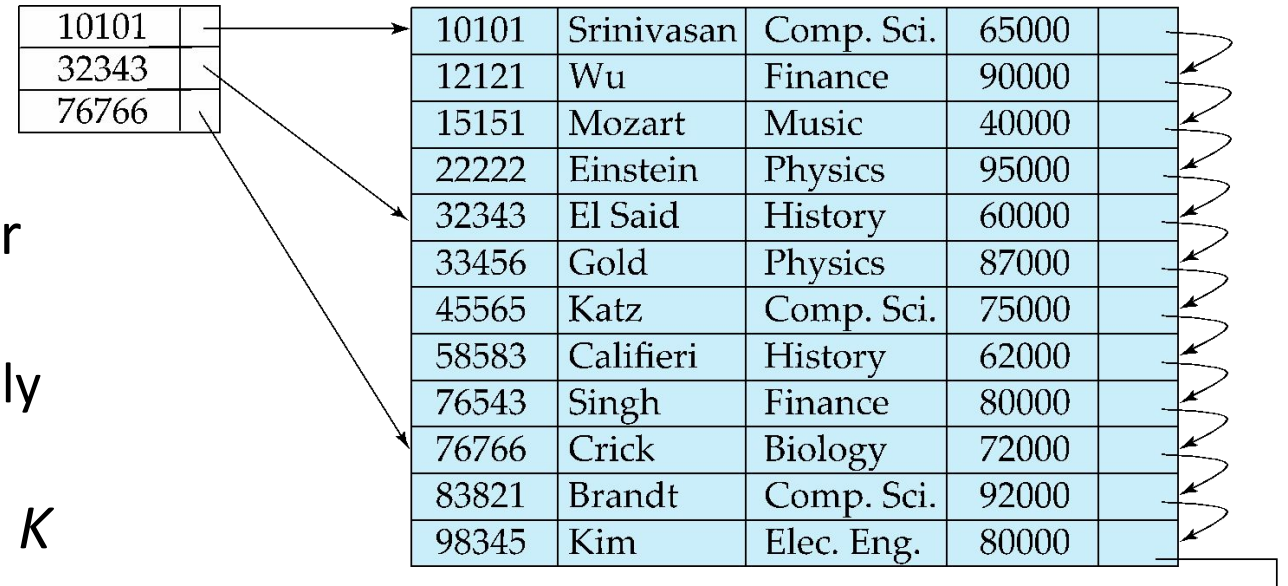
Dense Index Files (Cont.)

- Dense index on *dept_name*, with *instructor* file sorted on *dept_name*

Biology		76766	Crick	Biology	72000	
Comp. Sci.		10101	Srinivasan	Comp. Sci.	65000	
Elec. Eng.		45565	Katz	Comp. Sci.	75000	
Finance		83821	Brandt	Comp. Sci.	92000	
History		98345	Kim	Elec. Eng.	80000	
Music		12121	Wu	Finance	90000	
Physics		76543	Singh	Finance	80000	
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		22222	Einstein	Physics	95000	
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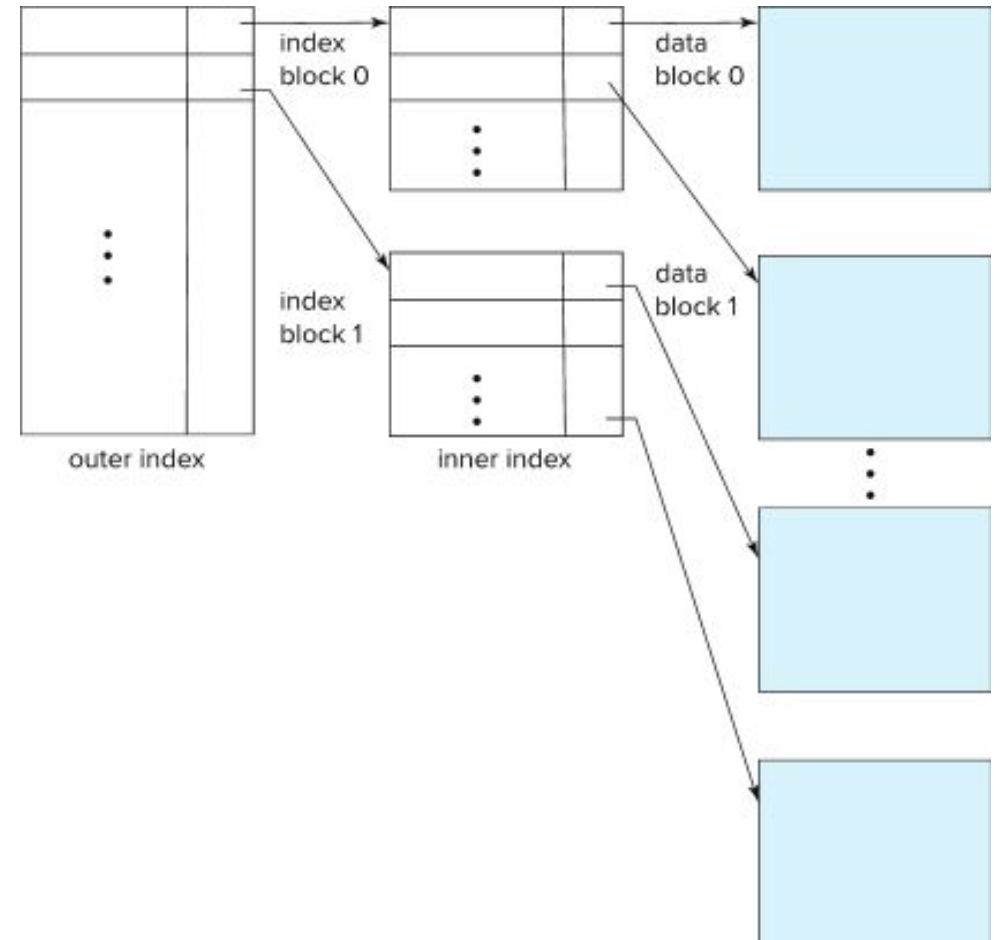
Sparse Index Files

- **Sparse Index:** contains index records for only some search-key values.
 - Applicable when records are sequentially ordered on search-key
- To locate a record with search-key value K we:
 - Find index record with largest search-key value $< K$
 - Search file sequentially starting at the record to which the index record points



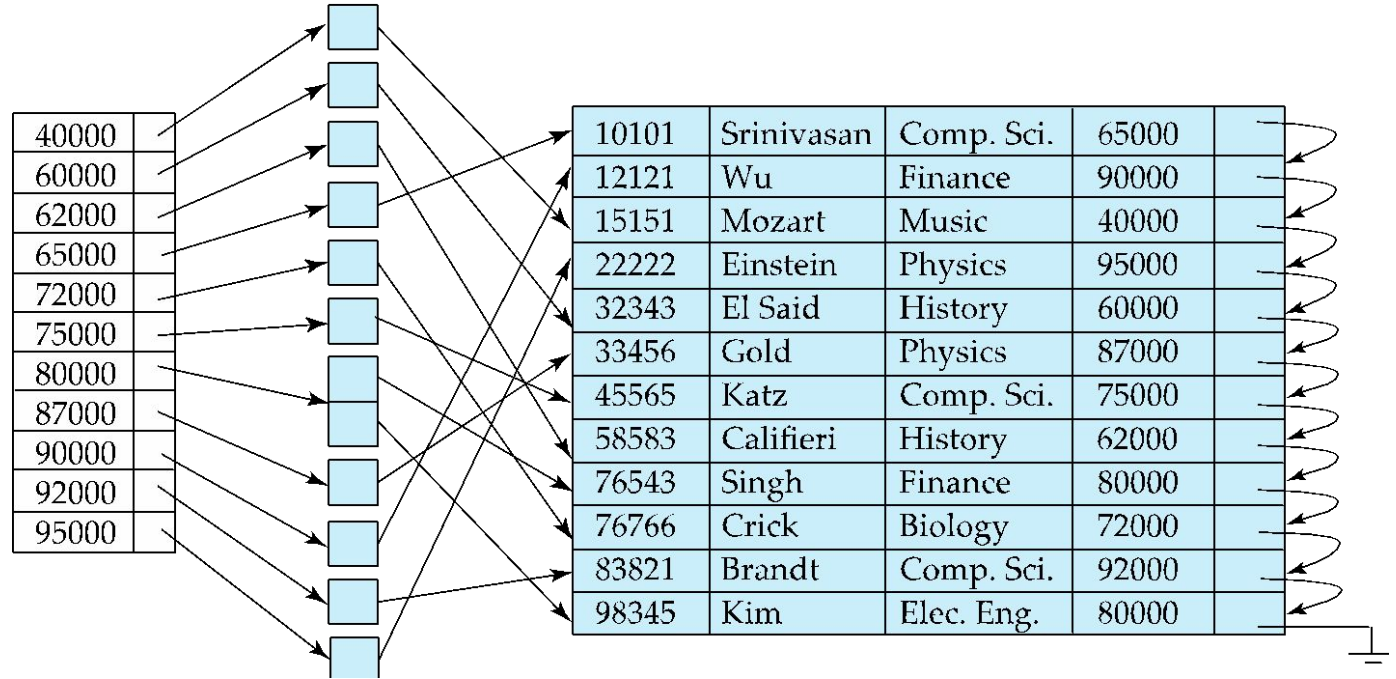
Multilevel Index

- If index does not fit in memory, access becomes expensive.
- Solution: treat index kept on disk as a sequential file and construct a sparse index on it.
 - outer index – a sparse index of the basic index
 - inner index – the basic index file
- If even outer index is too large to fit in main memory, yet another level of index can be created, and so on.
- Indices at all levels must be updated on insertion or deletion from the file.



Secondary Index Example

- Secondary index on salary field of instructor
- Index record points to a bucket that contains pointers to all the actual records with that particular search-key value.
- Secondary indices on unsorted columns have to be dense

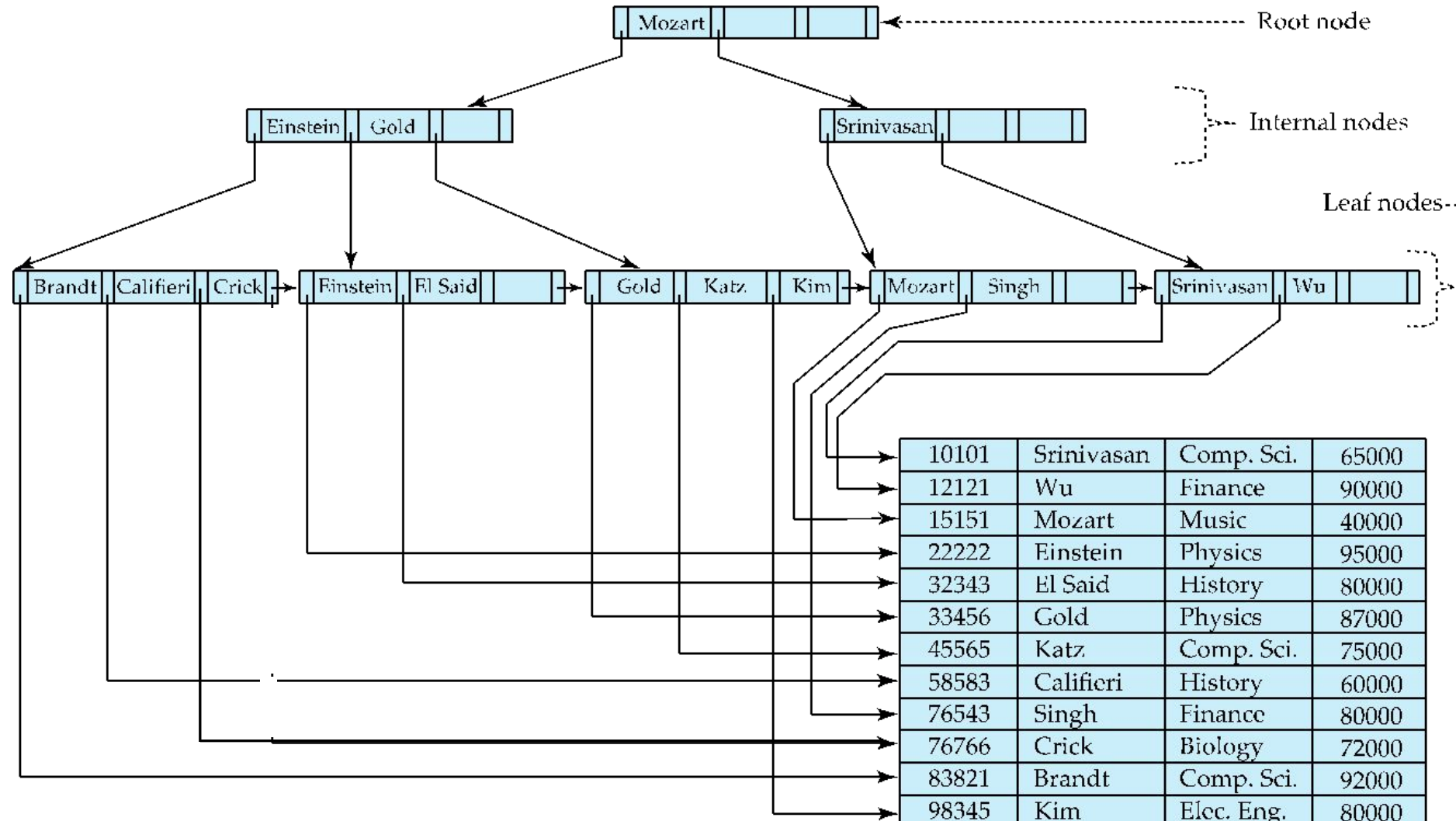


B⁺-Tree Index Files

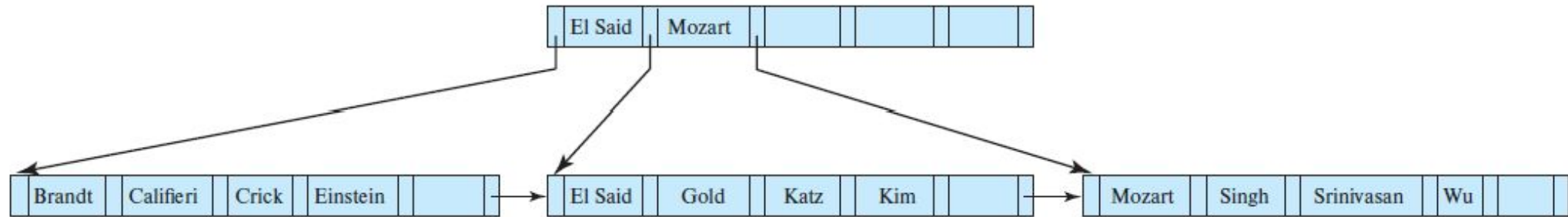
- B⁺-tree is a rooted tree satisfying the following properties:
 - All paths from root to leaf are of the same length
 - Each node that is not a root or a leaf has between $\lceil n/2 \rceil$ and n children.
 - A leaf node has between $\lceil (n-1)/2 \rceil$ and $n-1$ values
 - Special cases:
 - If the root is not a leaf, it has at least 2 children.
 - If the root is a leaf (that is, there are no other nodes in the tree), it can have between 0 and $(n-1)$ values
- General structure

P_1	K_1	P_2	\dots	P_{n-1}	K_{n-1}	P_n
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Example of a B⁺-Tree ($n = 4$)



Example of a B⁺-Tree ($n = 6$)



File organization and indexing

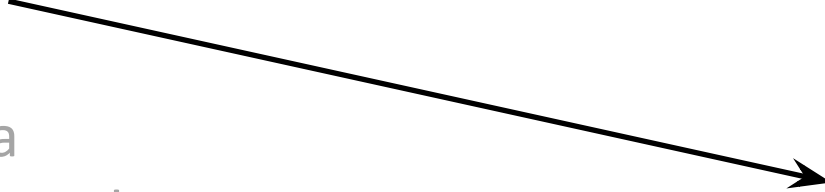
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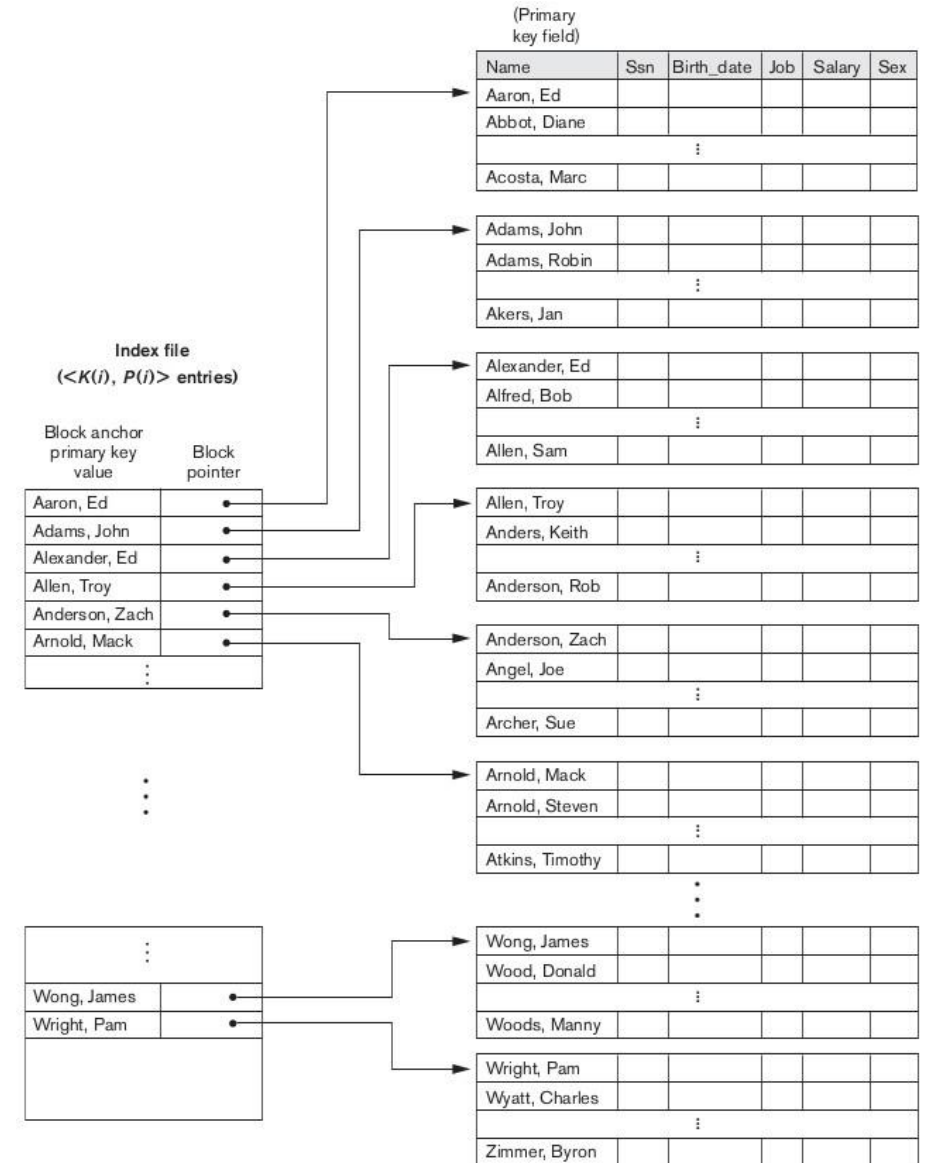
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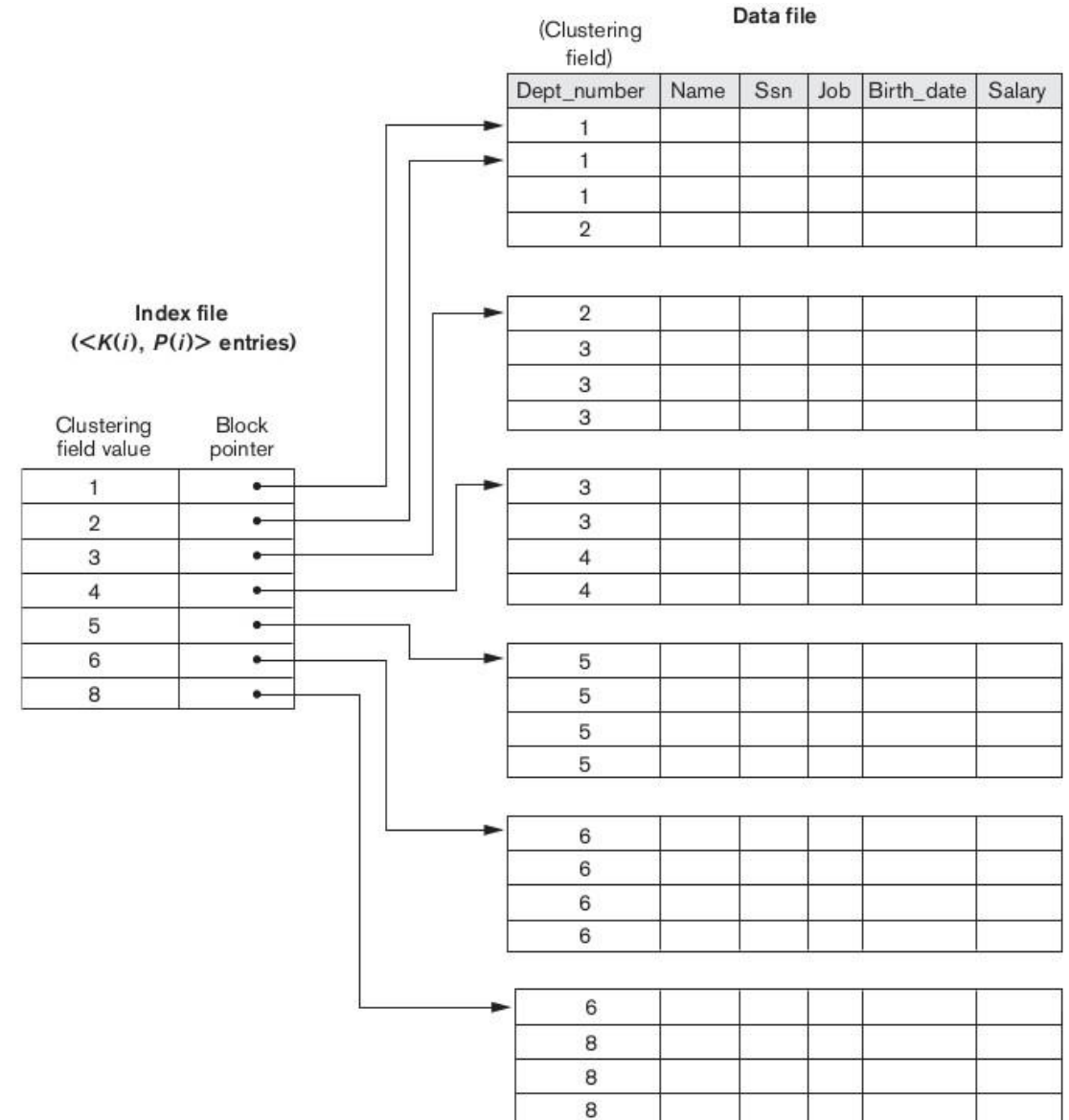
Primary index

- Indexing Field = Key
- File is physically sorted on indexing field
- One index entry *per block*
- Index pointers can be block pointers (anchors)
- Sparse Index



Clustered index

- Indexing Field = Non-Key
- File is physically sorted on indexing field
- One index entry *per distinct value*
- Index pointer is block pointer to first block with the value
- Sparse Index



Index classification: Summary

Type of Index	Indexing Field	File physically sorted on indexing field?	Index Entries	Index Pointers	Sparse or Dense?
Primary	Key	Yes	One per block	Block anchor	Sparse
Clustering	Non-Key	Yes	One per value	Block pointer	Sparse
Secondary Key	Key	No	One per record	Record pointer	Dense
Secondary Non-Key	Non-Key	No	One per record/ value	Record pointer/ Variable length/ indirection	Dense

File organization and indexing

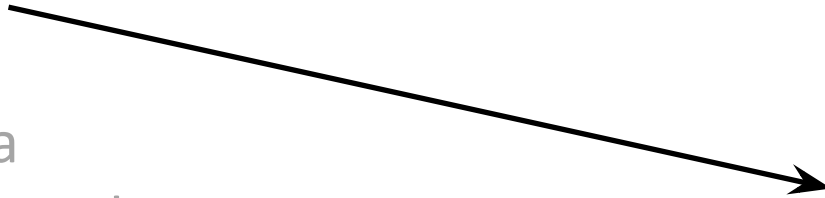
- File Organization

- Heap & Sorted Files

- Indexing

- Meta-data

- System Catalog



- Index Classification

- Clustered/Unclustered

- Sparse/Dense

- Types of Indexes

- Primary

- Clustering

- Secondary Key

- Secondary Non-Key

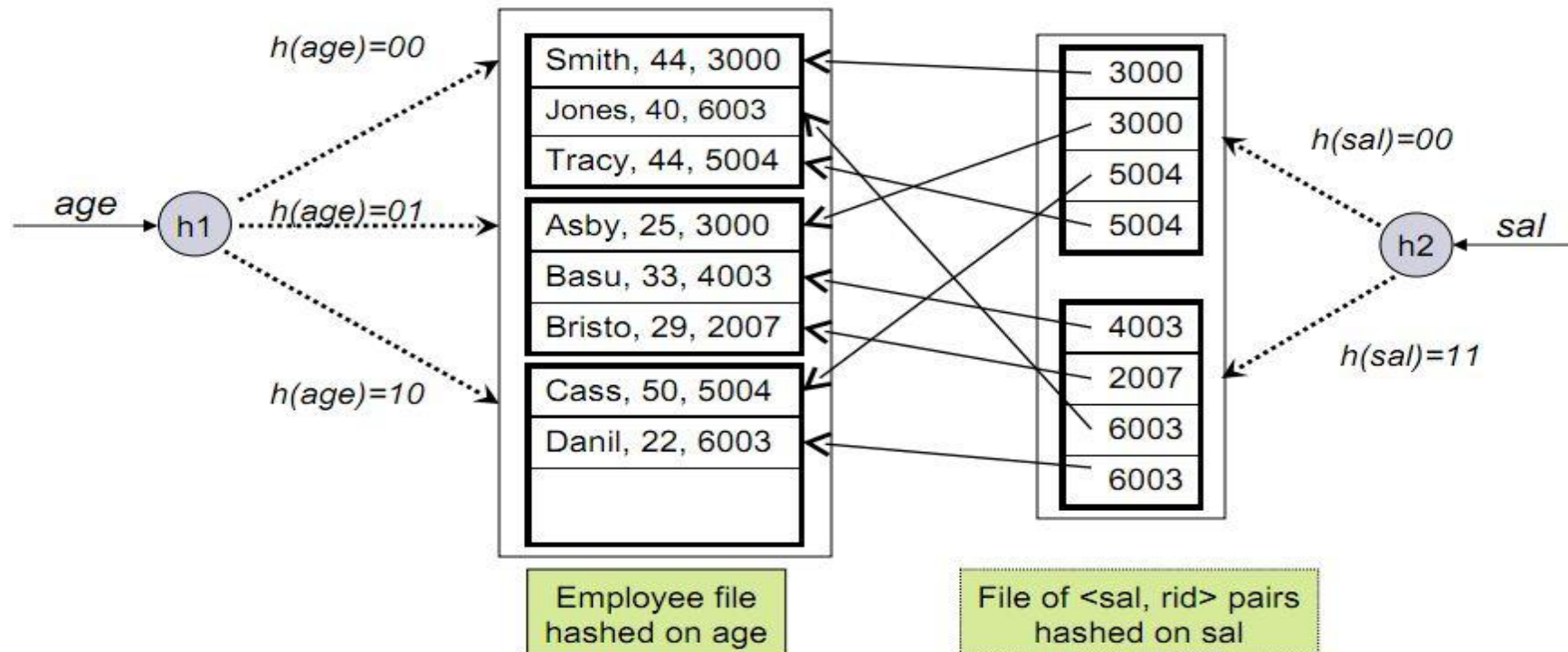
- Indexing techniques

- Hash vs tree

- Choosing search key

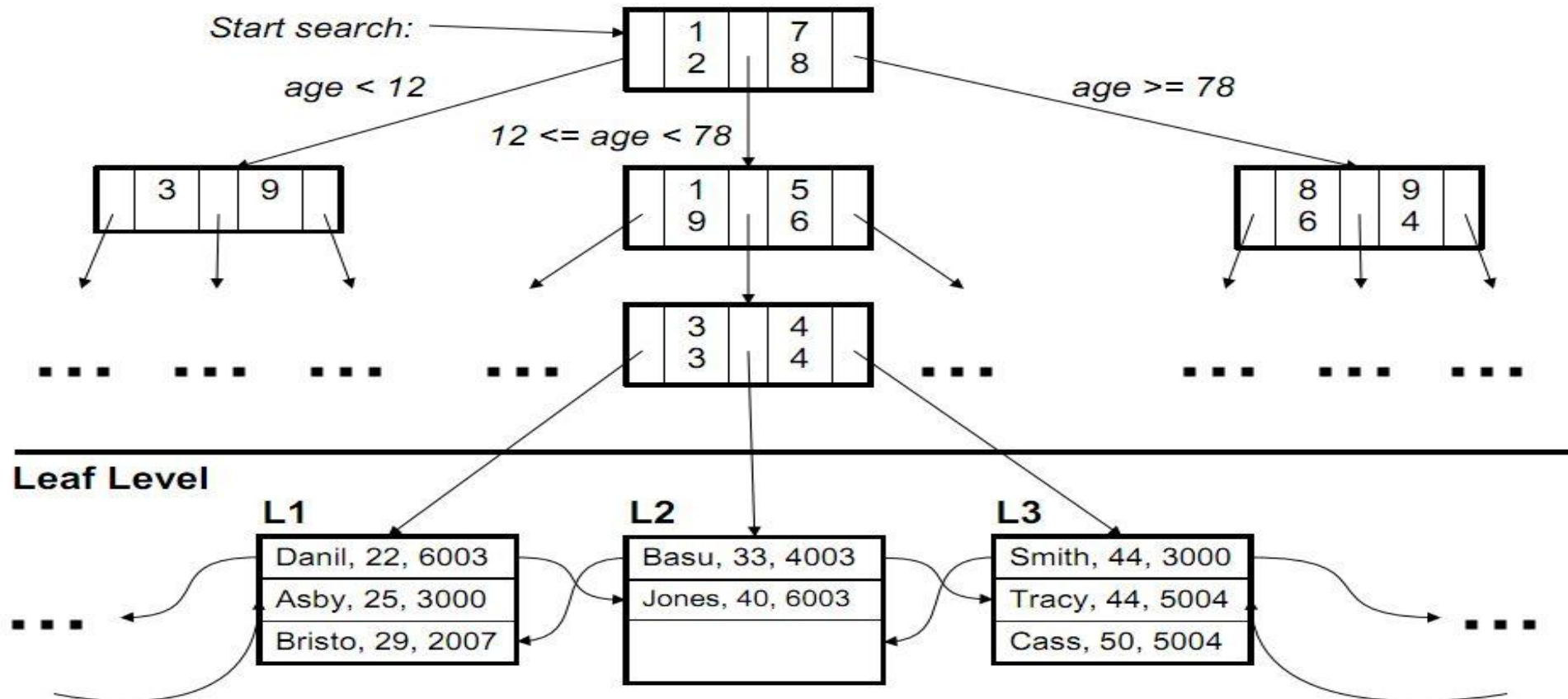
Hash-based index

- Good for **equality** selections
 - File = a collection of **buckets**
 - Bucket = **primary page** plus 0 or more **overflow pages**
 - **Hash function h** : $h(r.\text{search_key}) = \text{bucket for record } r$



Tree-based index

- Good for **range** selections
 - Leaves contain data entries sorted by search key value
 - **B+ tree**: all root->leaf paths have equal length (*height*)



Indexing decisions are driven by queries

```
Select E.dno  
From Employees E  
Where E.age > 40
```

- Would you build a b+tree index or hash index?
 - Hint: it's not an equality query
- Would you build a clustered index?
- When would a B+tree be suboptimal?
 - Hint: think about selectivity

File organization and indexing

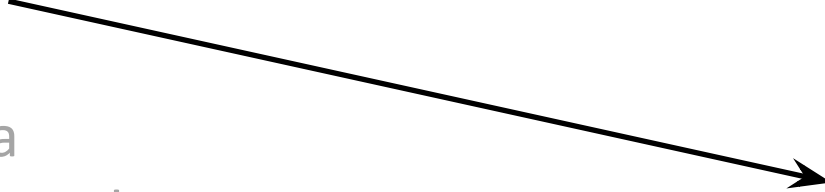
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Choosing a search key

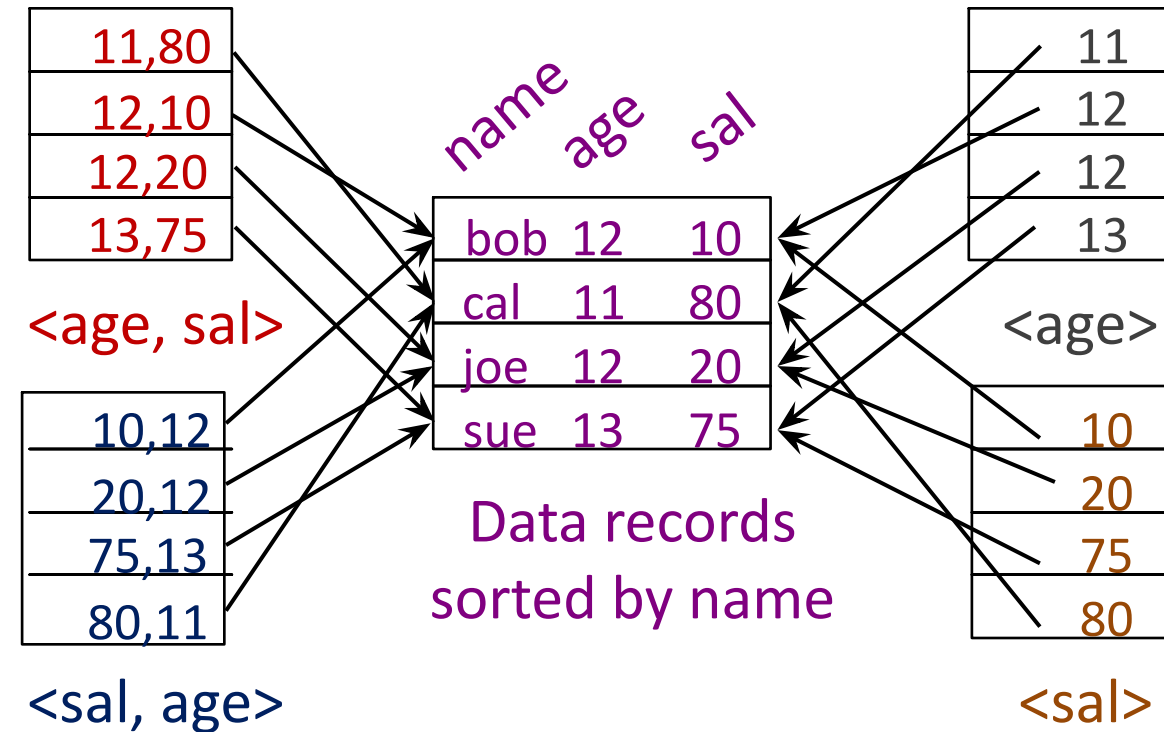
```
Select sID  
From Student  
Where sName = 'Mary' And GPA > 3.9
```

- Can build an index on sname
 - What index would this be? Hash or tree?
- Can build index on GPA
 - What index would this be? Hash or tree?
- How about <sname, gpa> together?

Composite search key

- Search on field *combination*.
 - **Equality query**: Every field value is equal to a constant. E.g. wrt <sal,age> index:
 - age=12 and sal =75
 - **Range query**: Some field value is not a constant. E.g.:
 - age =12; or age=12 and sal > 20
- Data entries in index sorted by search key for range queries
 - **Lexicographic order**.

Examples of
composite key indexes using lexicographic
order



Composite search key: Tradeoffs

```
Select  AVG(E.sal)
From    Employees E
Where   E.age = 25
        AND E.sal BETWEEN 3000 AND 5000
```

- Do we build index on <age,sal>, <sal,age>?
- What index would this be? Hash or tree?
- Do we really need data file?
 - “index-only evaluation” is possible

File organization and indexing

- File Organization
- Heap & Sorted Files
- Indexing
- Meta-data
 - System Catalog

System catalogs

- For each relation:
 - name, file name, file structure (e.g., Heap file)
 - attribute name and type, for each attribute
 - index name, for each index
 - integrity constraints
- For each index:
 - structure (e.g., B+ tree) and search key fields
- For each view:
 - view name and definition
- Plus stats, authorization, buffer pool size, etc.

Catalogs are themselves stored as relations!

System catalog in Oracle

```
> desc user_tables
```

Name	Null?	Type
TABLE_NAME	NOT NULL	VARCHAR2(128)
TABLESPACE_NAME		VARCHAR2(30)
CLUSTER_NAME		VARCHAR2(128)
IOT_NAME		VARCHAR2(128)
STATUS		VARCHAR2(8)
PCT_FREE		NUMBER
PCT_USED		NUMBER
...		

```
> desc user_tab_columns
```

Name	Null?	Type
OWNER	NOT NULL	VARCHAR2(128)
TABLE_NAME	NOT NULL	VARCHAR2(128)
COLUMN_NAME	NOT NULL	VARCHAR2(128)
DATA_TYPE		VARCHAR2(128)
DATA_TYPE_MOD		VARCHAR2(3)
DATA_TYPE_OWNER		VARCHAR2(128)
DATA_LENGTH	NOT NULL	NUMBER
DATA_PRECISION		NUMBER
DATA_SCALE		NUMBER
NULLABLE		VARCHAR2(1)
...		

System catalog in Oracle

```
> select * from student;
```

SID	NAME	AGE
A1234	John	23
B1	Xavier	24
A21341	Scott	21
C12948291	Benjamin	25
1948	Ben	29

```
> select table_name, num_rows, blocks, avg_row_len from user_tables;
```

TABLE_NAME	NUM_ROWS	BLOCKS	AVG_ROW_LEN
STUDENT	5	5	20

```
> select table_name, column_name, data_type, data_length from user_tab_columns;
```

TABLE_NAME	COLUMN_NAME	DATA_TYPE	DATA_LENGTH
STUDENT	SID	CHAR	10
STUDENT	NAME	VARCHAR2	32
STUDENT	AGE	NUMBER	22

Summary

- Database organized as a collection of files
 - Several file organizations (heap, sorted, ...) with tradeoffs
- Files are a collection of pages
 - Several page layouts (NSM, DSM, ...) with tradeoffs
- Pages contain a collection of records
 - Several record formats (fixed, variable length...) with tradeoffs
- Index is a quick way to find records
 - Several index types with tradeoffs

One size does not fit all!