

CSE544

Data Management

Lectures 7

Storage Manager

Announcements

- Project teams due Friday
- HW2 is posted
- Review of PAX due on Monday

Relational Algebra

Which operations are monotone?

Five operators:

- Selection σ
- Projection Π
- Join or cartesian product $\bowtie$, $\times$
- Union $\cup$
- Difference $-$

Monotone

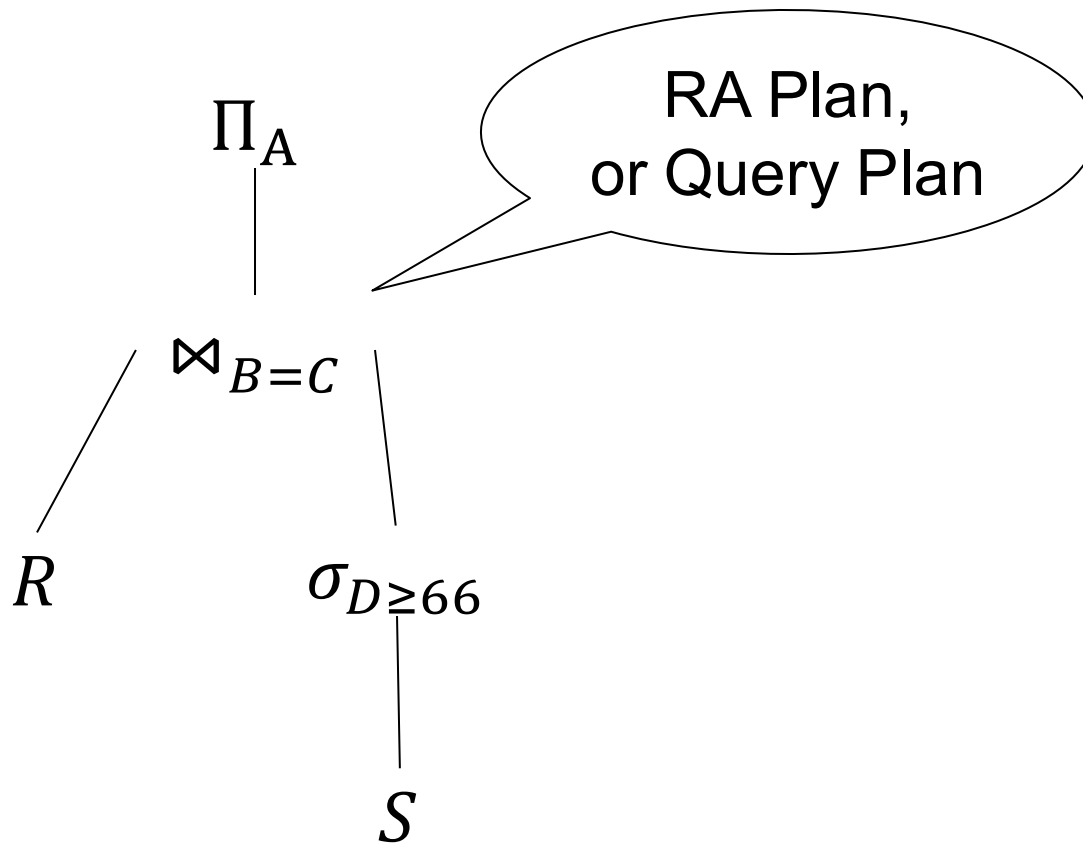
Non-monotone

RA by Example

$$\Pi_A(R \bowtie_{B=C} \sigma_{D \geq 66}(S))$$

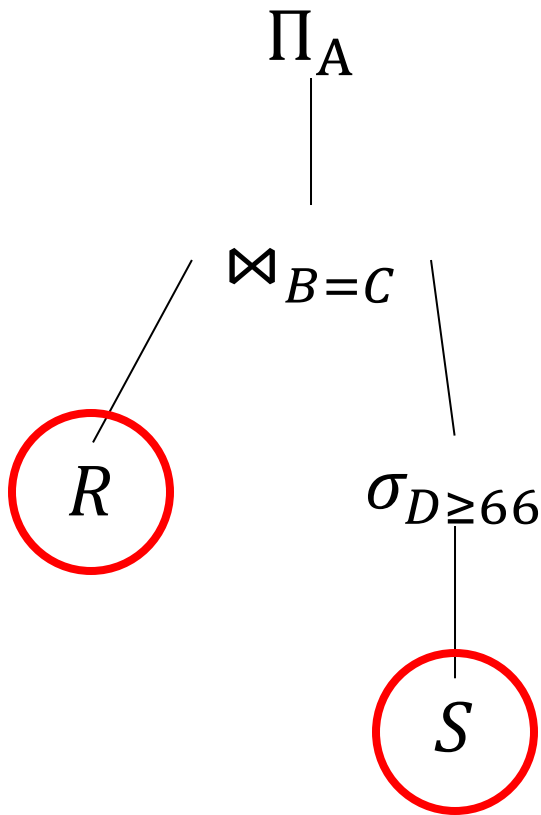
RA by Example

$$\Pi_A(R \bowtie_{B=C} \sigma_{D \geq 66}(S))$$



RA by Example

$$\Pi_A(R \bowtie_{B=C} \sigma_{D \geq 66}(S))$$



R=

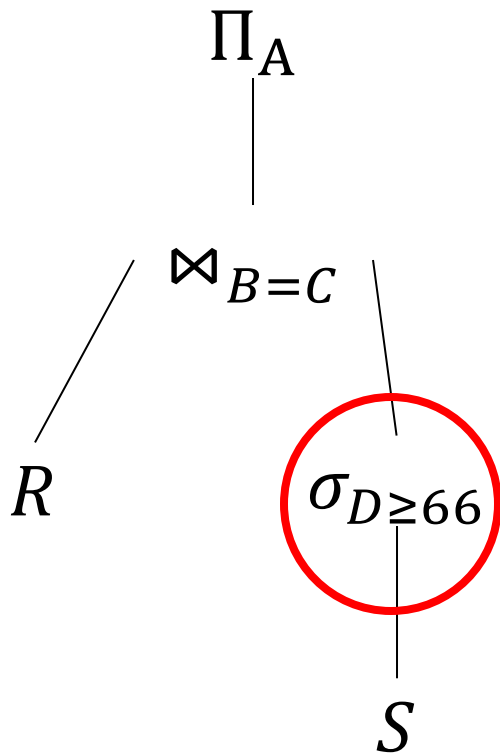
A	B
1	10
1	20
2	20

S=

C	D
10	33
10	44
20	55
20	66
20	77
30	66

RA by Example

$$\Pi_A(R \bowtie_{B=C} \sigma_{D \geq 66}(S))$$



R=

A	B
1	10
1	20
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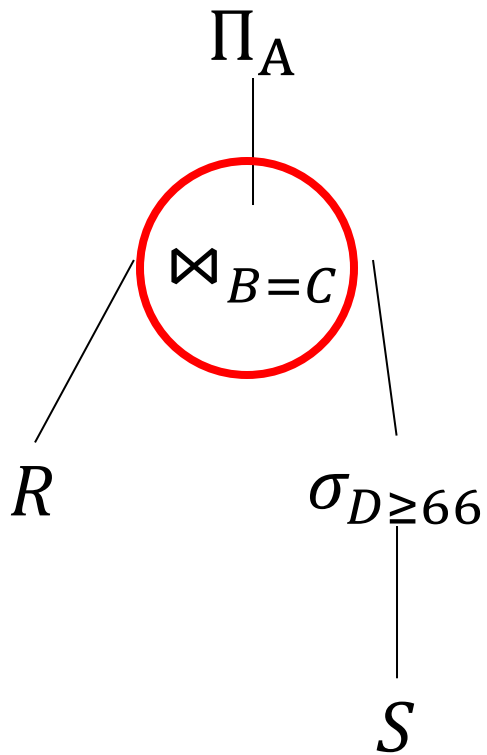
S=

C	D
20	66
20	77
30	66

C	D
10	33
10	44
20	55
20	66
20	77
30	66

RA by Example

$$\Pi_A(R \bowtie_{B=C} \sigma_{D \geq 66}(S))$$



A	B	C	D
1	20	20	66
1	20	20	77
2	20	20	66
2	20	20	77

C	D
20	66
20	77
30	66

R=

A	B
1	10
1	20
2	20

S=

C	D
10	33
10	44
20	55
20	66
20	77
30	66

RA by Example

A
1
2

Final output

A	B	C	D
1	20	20	66
1	20	20	77
2	20	20	66
2	20	20	77

C	D
20	66
20	77
30	66

C	D
10	33
10	44
20	55
20	66
20	77
30	66

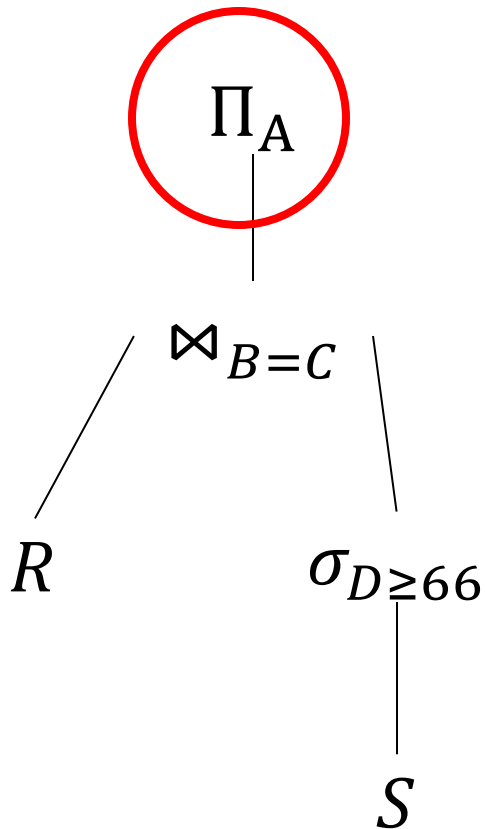
R=

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10	33
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20	55
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30	66

$$\Pi_A(R \bowtie_{B=C} \sigma_{D \geq 66}(S))$$



Relational Algebra

Five operators:

- Selection σ
- Projection Π
- Join or cartesian product $\bowtie$, $\times$
- Union $\cup$
- Difference $-$

Extended Relational Algebra

- Group-by and aggregate: γ
- Duplicate elimination: δ
- Sorting: τ



We only
discuss this

Group-by and Aggregates

$\gamma_{col1,col2,...,agg1,...}(T)$

Standard group-by:

```
SELECT col1,...,agg1(..),agg2(..)
FROM T
GROUP-BY condition;
```

$\gamma_{C,sum(D)}(S) =$

C	D
10	77
20	196
30	66

S=

C	D
10	33
10	44
20	55
20	66
20	77
30	66

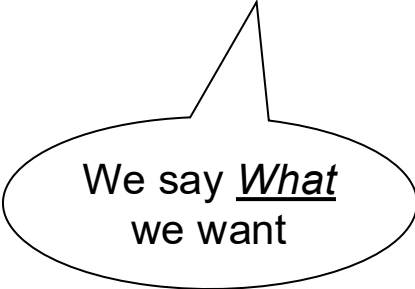
Translation

Every SQL query can be translated into an expression in the Extended RA

Product(pid, name, price)
Purchase(pid, cid, store)
Customer(cid, name, city)

SQL...

```
SELECT DISTINCT x.name, z.name  
FROM Product x, Purchase y, Customer z  
WHERE x.pid = y.pid and y.cid = y.cid and  
      x.price > 100 and z.city = 'Seattle'
```

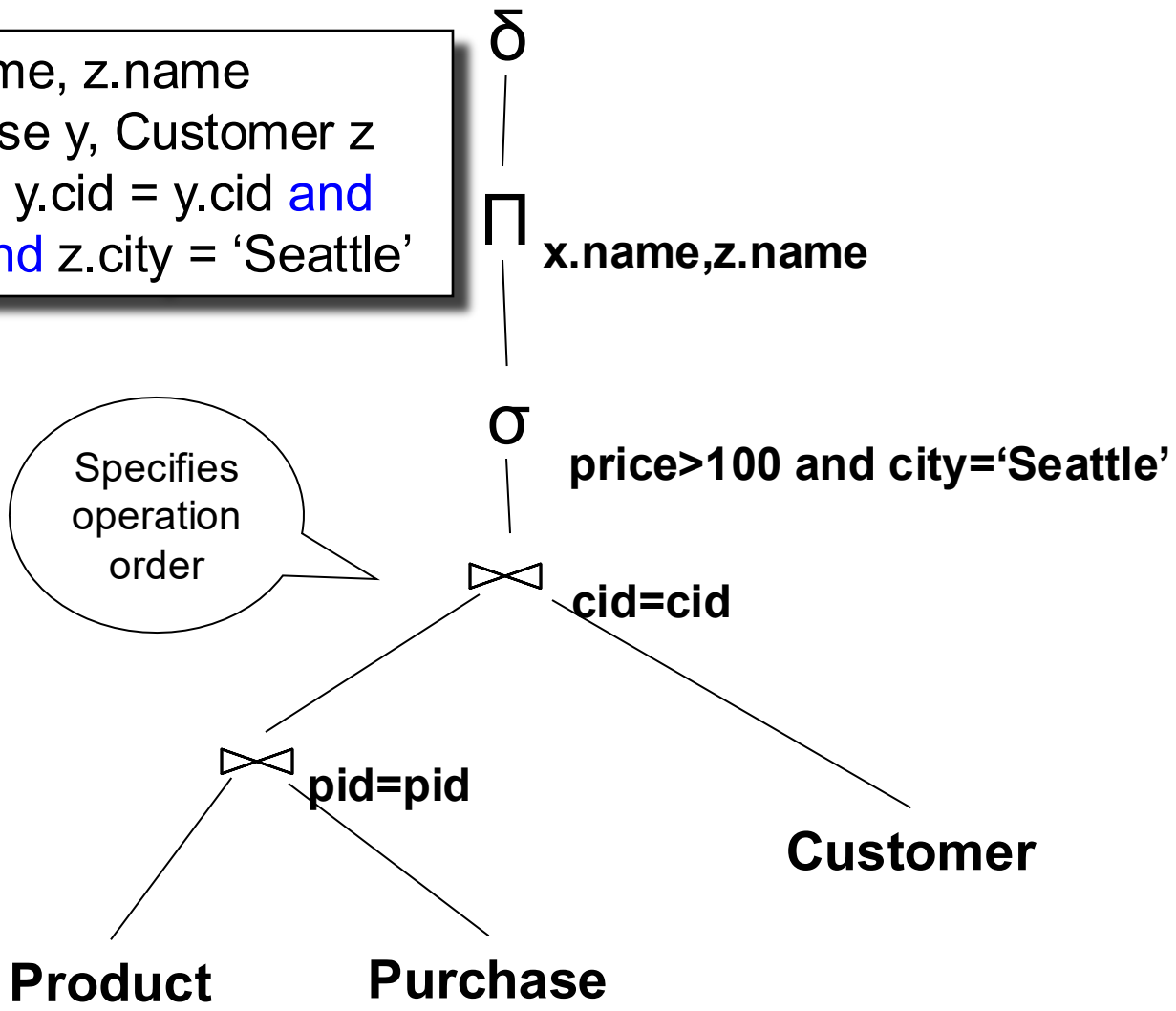


We say What
we want

Product(pid, name, price)
Purchase(pid, cid, store)
Customer(cid, name, city)

...to RA

SELECT DISTINCT x.name, z.name
FROM Product x, Purchase y, Customer z
WHERE x.pid = y.pid **and** y.cid = y.cid **and**
 x.price > 100 **and** z.city = 'Seattle'



Product(pid, name, price)
Purchase(pid, cid, store)
Customer(cid, name, city)

Optimization

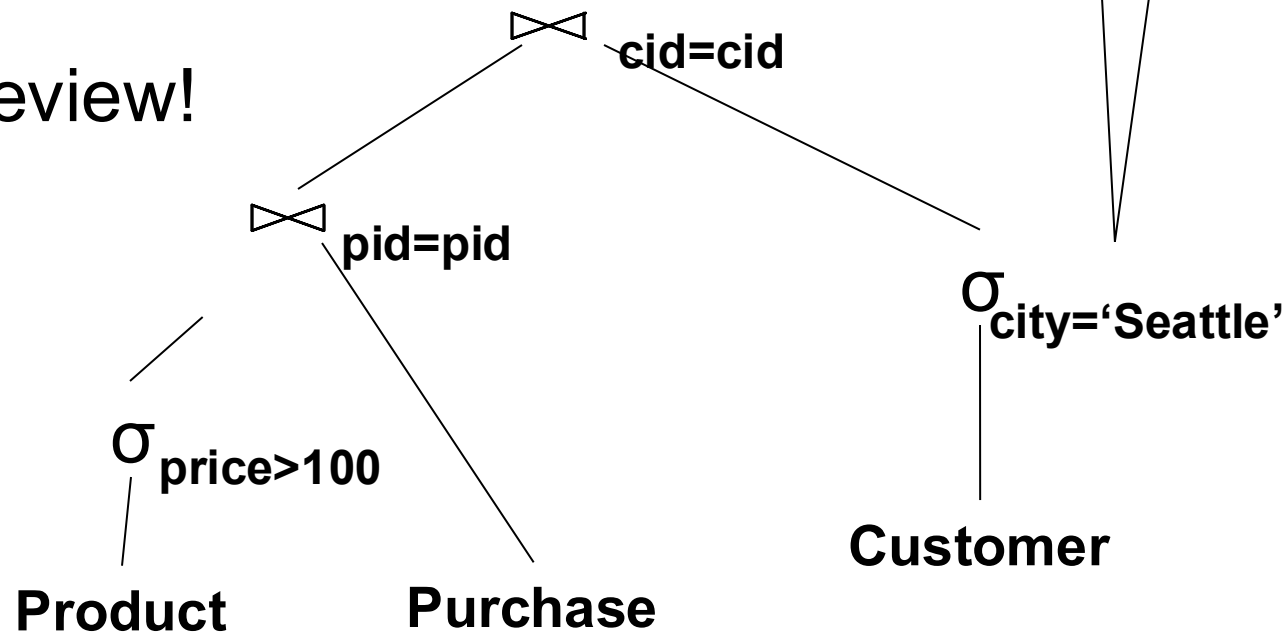
SELECT DISTINCT x.name, z.name
FROM Product x, Purchase y, Customer z
WHERE x.pid = y.pid **and** y.cid = z.cid **and**
 x.price > 100 **and** z.city = 'Seattle'



Push
selections
down

This is a quick preview!

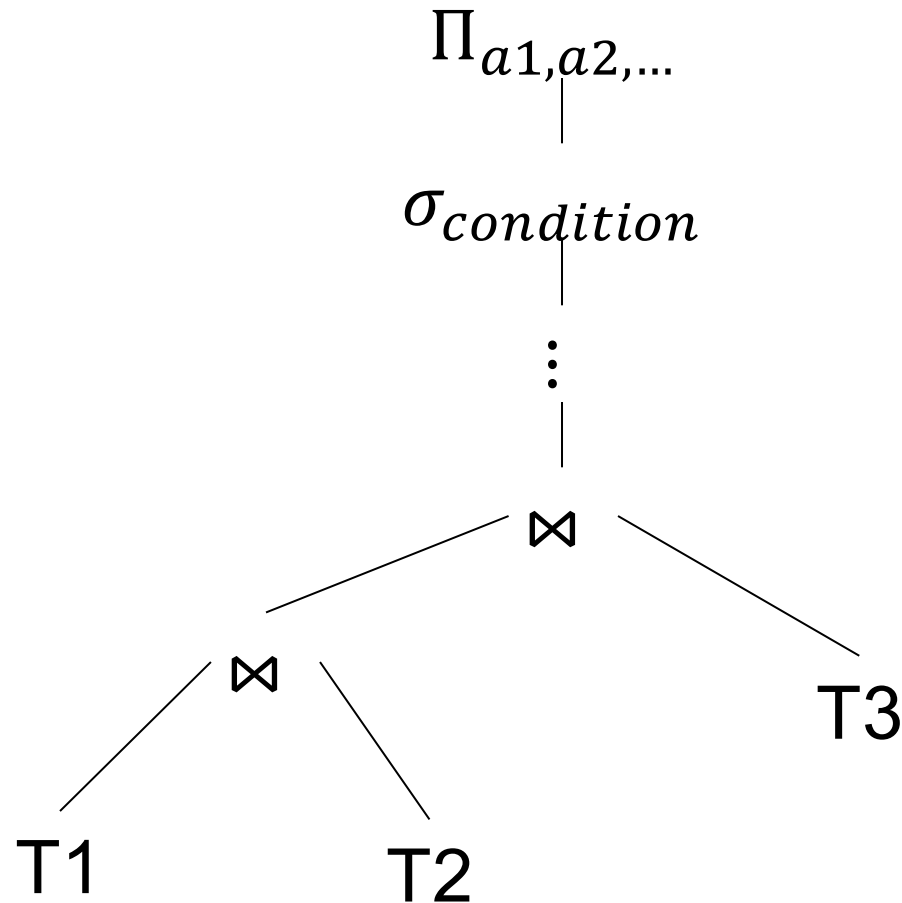
More about this
next lectures



SQL to RA

Simple SFW

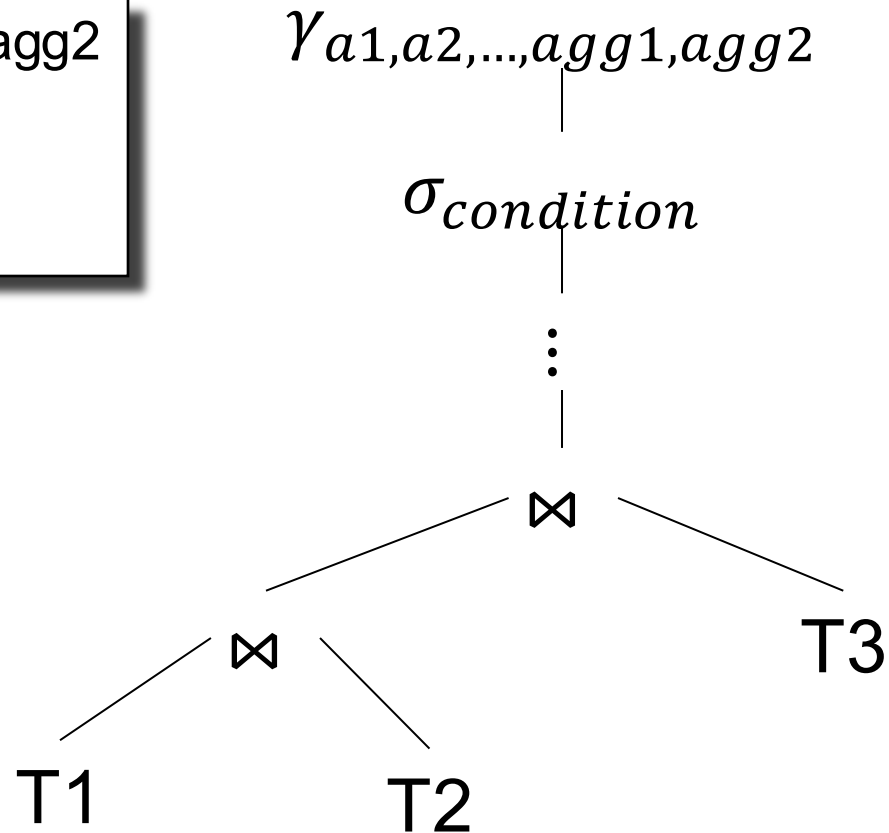
```
SELECT a1,a2,...  
FROM T1, T2, ...  
WHERE condition
```



SQL to RA

...add GROUP-BY

```
SELECT a1,a2,...,agg1,agg2  
FROM T1, T2, ...  
WHERE condition  
GROUP BY a1,a2,...
```



SQL to RA

$\Pi_{\text{only-what-we-need}}$

Both HAVING and
WHERE use σ

...add HAVING

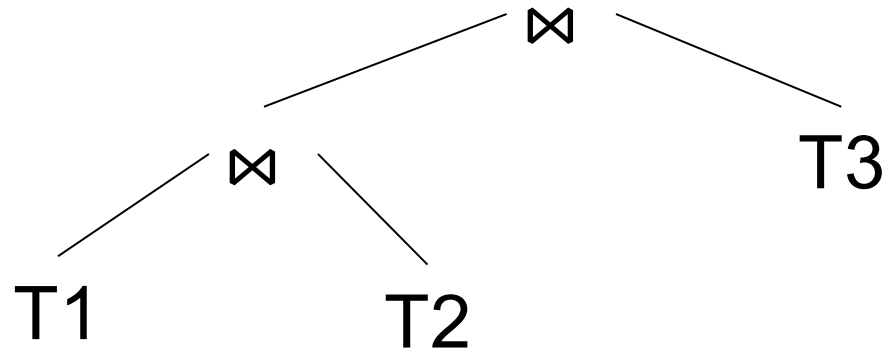
```
SELECT a1,a2,...,agg1,agg2  
FROM T1, T2, ...  
WHERE condition1  
GROUP BY a1,a2,...  
HAVING condition2
```

$\sigma_{\text{condition2}}$

$\gamma_{a1,a2,...,agg1,agg2,agg3,...}$

$\sigma_{\text{condition1}}$

$\vdots$



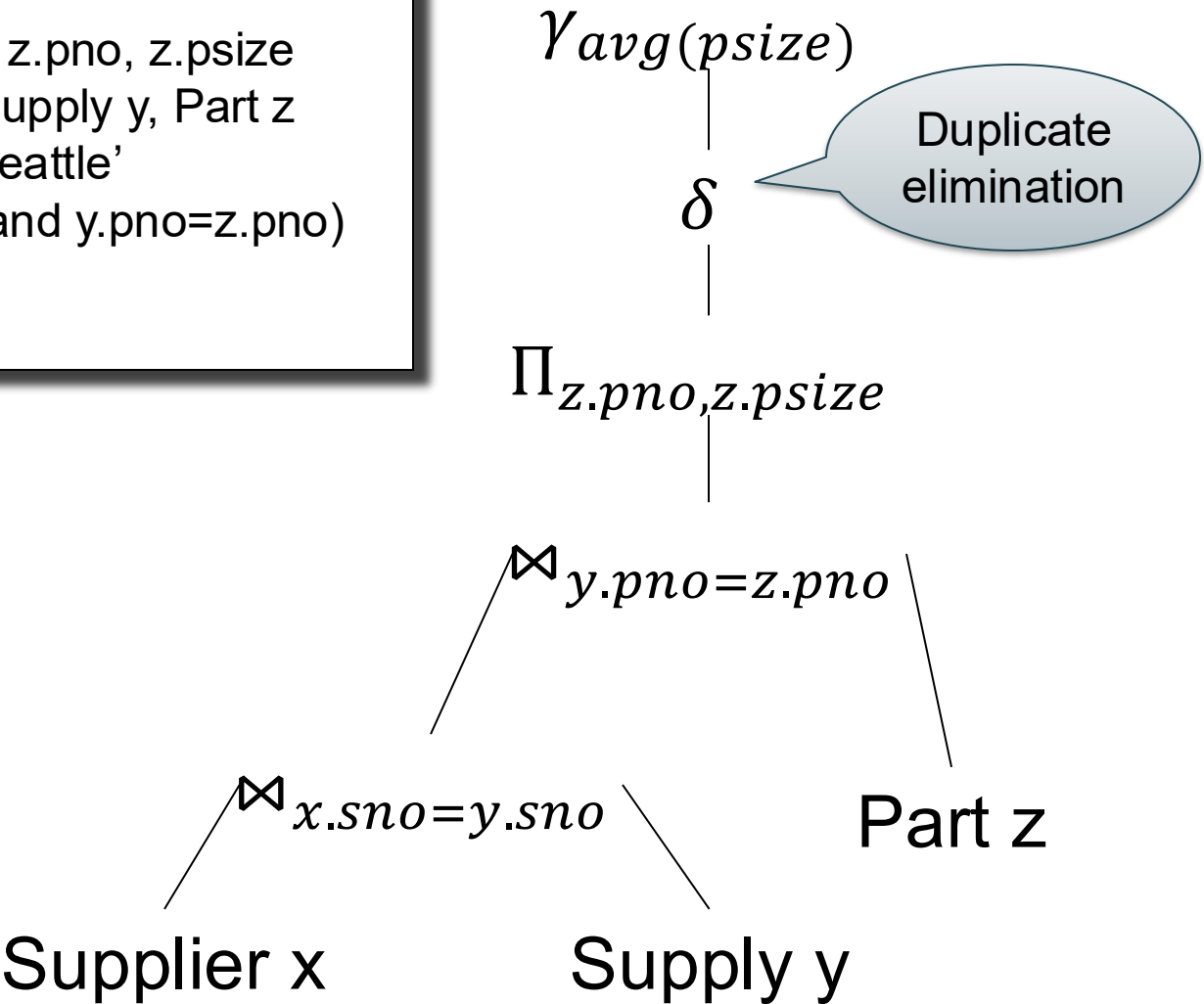
SQL to RA

- SQL queries without subqueries are straightforward to translate
- Subqueries may need to be flattened, then translated to SQL -- next

Supplier (sno, sname, scity, sstate)
Supply (sno, pno, qty, price)
Part (pno, pname, psize, pcolor)

Subqueries

```
WITH Tmp AS (  
    SELECT DISTINCT z.pno, z.psize  
    FROM Supplier x, Supply y, Part z  
    WHERE x.scity = 'Seattle'  
           and x.sno=y.sno and y.pno=z.pno)  
SELECT avg(psize)  
FROM Tmp;
```



Supplier (sno, sname, scity, sstate)

Supply (sno, pno, qty, price)

Part (pno, pname, psize, pcolor)

Subqueries

Find all suppliers in 'WA'
that supply only parts
under \$100

Supplier (sno, sname, scity, sstate)
Supply (sno, pno, qty, price)
Part (pno, pname, psize, pcolor)

Subqueries

```
SELECT x.sno
FROM Supplier x
WHERE x.sstate = 'WA'
      and not exists
      (SELECT *
       FROM Supply y
       WHERE x.sno = y.sno
            and y.price > 100)
```

Find all suppliers in 'WA'
that supply only parts
under \$100

Supplier (sno, sname, scity, sstate)
Supply (sno, pno, qty, price)
Part (pno, pname, psize, pcolor)

Subqueries

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       FROM Supply y
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            and y.price > 100)
```

Find all suppliers in 'WA'
that supply only parts
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Translate to RA

Supplier(sno, sname, scity, sstate)
Supply(sno, pno, qty, price)
Part(pno, pname, psize, pcolor)

Subqueries

```
SELECT x.sno
FROM Supplier x
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       FROM Supply y
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```

Supplier x

Supplier(sno, sname, scity, sstate)
Supply(sno, pno, qty, price)
Part(pno, pname, psize, pcolor)

Subqueries

```
SELECT x.sno
FROM Supplier x
WHERE x.sstate = 'WA'
    and not exists
    (SELECT *
     FROM Supply y
     WHERE x.sno = y.sno
           and y.price > 100)
```

$\sigma_{x.sstate='WA' \wedge \neg \exists (...)}$

Supplier x

Supply y

Supplier(sno, sname, scity, sstate)
Supply(sno, pno, qty, price)
Part(pno, pname, psize, pcolor)

Subqueries

```
SELECT x.sno
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```

$\sigma_{x.sstate='WA' \wedge \neg \exists (...)}$

Supplier x

Supply y

Totally wrong!!

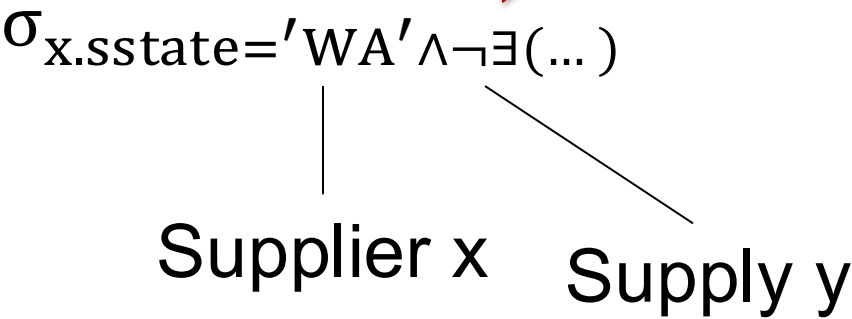
Supplier(sno, sname, scity, sstate)
Supply(sno, pno, qty, price)
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Subqueries

```
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FROM Supplier x
WHERE x.sstate = 'WA'
    and not exists
    (SELECT *
     FROM Supply y
     WHERE x.sno = y.sno
        and y.price > 100)
```

Need to unnest

Totally wrong!!



Supplier (sno, sname, scity, sstate)
Supply (sno, pno, qty, price)
Part (pno, pname, psize, pcolor)

Subqueries

```
SELECT x.sno
FROM Supplier x
WHERE x.sstate = 'WA'
    and not exists
    (SELECT *
     FROM Supply y
     WHERE x.sno = y.sno
        and y.price > 100)
```

Need to unnest

Correlation !

Supplier (sno, sname, scity, sstate)
Supply (sno, pno, qty, price)
Part (pno, pname, psize, pcolor)

Subqueries

```
SELECT x.sno
FROM Supplier x
WHERE x.sstate = 'WA'
      and not exists
      (SELECT *
       FROM Supply y
       WHERE x.sno = y.sno
              and y.price > 100)
```

De-Correlation

```
SELECT x.sno
FROM Supplier x
WHERE x.sstate = 'WA'
      and x.sno not in
      (SELECT y.sno
       FROM Supply y
       WHERE y.price > 100)
```

Supplier (sno, sname, scity, sstate)
Supply (sno, pno, qty, price)
Part (pno, pname, psize, pcolor)

Subqueries

Un-nest

```
(SELECT x.sno
FROM Supplier x
WHERE x.sstate = 'WA')
EXCEPT
(SELECT y.sno
FROM Supply y
WHERE y.price > 100)
```

```
SELECT x.sno
FROM Supplier x
WHERE x.sstate = 'WA'
and x.sno not in
  (SELECT y.sno
   FROM Supply y
   WHERE y.price > 100)
```

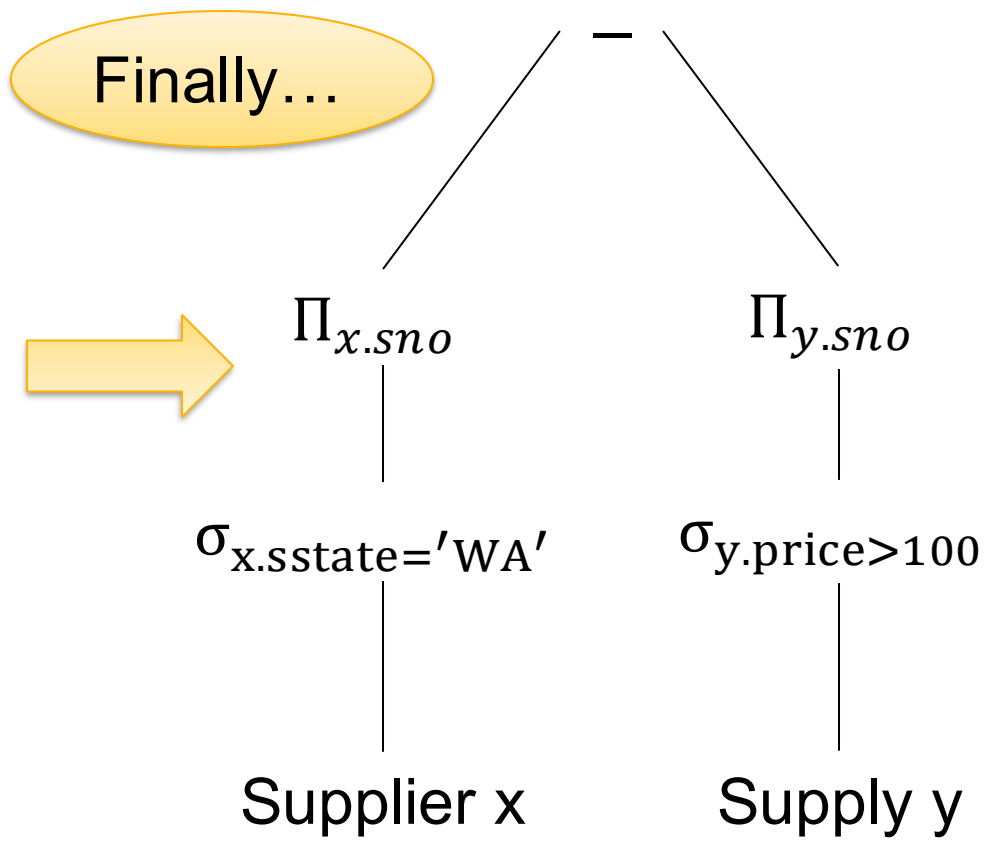


EXCEPT = set difference

```
Supplier(sno, sname, scity, sstate)
Supply(sno, pno, qty, price)
Part(pno, pname, psize, pcolor)
```

Subqueries

```
(SELECT x.sno
FROM Supplier x
WHERE x.sstate = 'WA')
EXCEPT
(SELECT y.sno
FROM Supply y
WHERE y.price > 100)
```



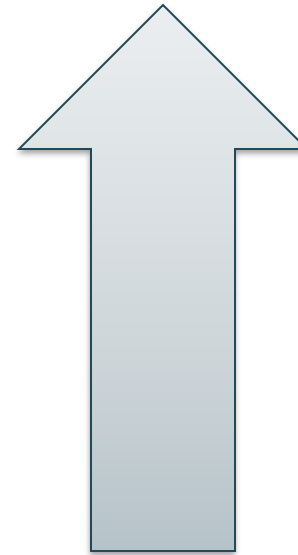
Summary

- User writes in SQL
 - Declarative language
 - Users say WHAT they want
- System: SQL $\rightarrow$ Relational Algebra
 - Explicit operation order: HOW to compute
 - RA expression a.k.a. Query Plan
- Query Plan: is optimized, then **executed**

Database Internals

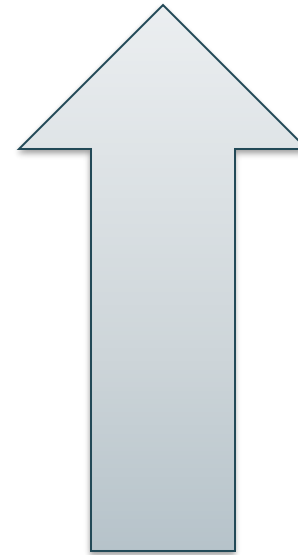
Database Management System

- Query optimizer
- Operator execution
- Access method
- Buffer pool manager
- Disk manager



Database Management System

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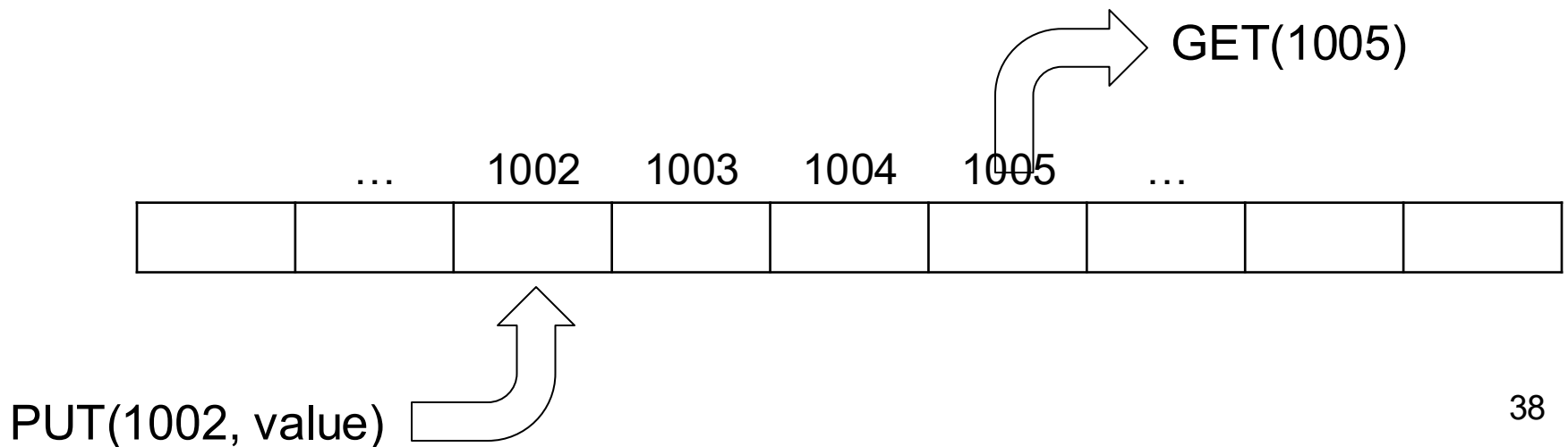


Today: storage manager and (briefly) buffer manager

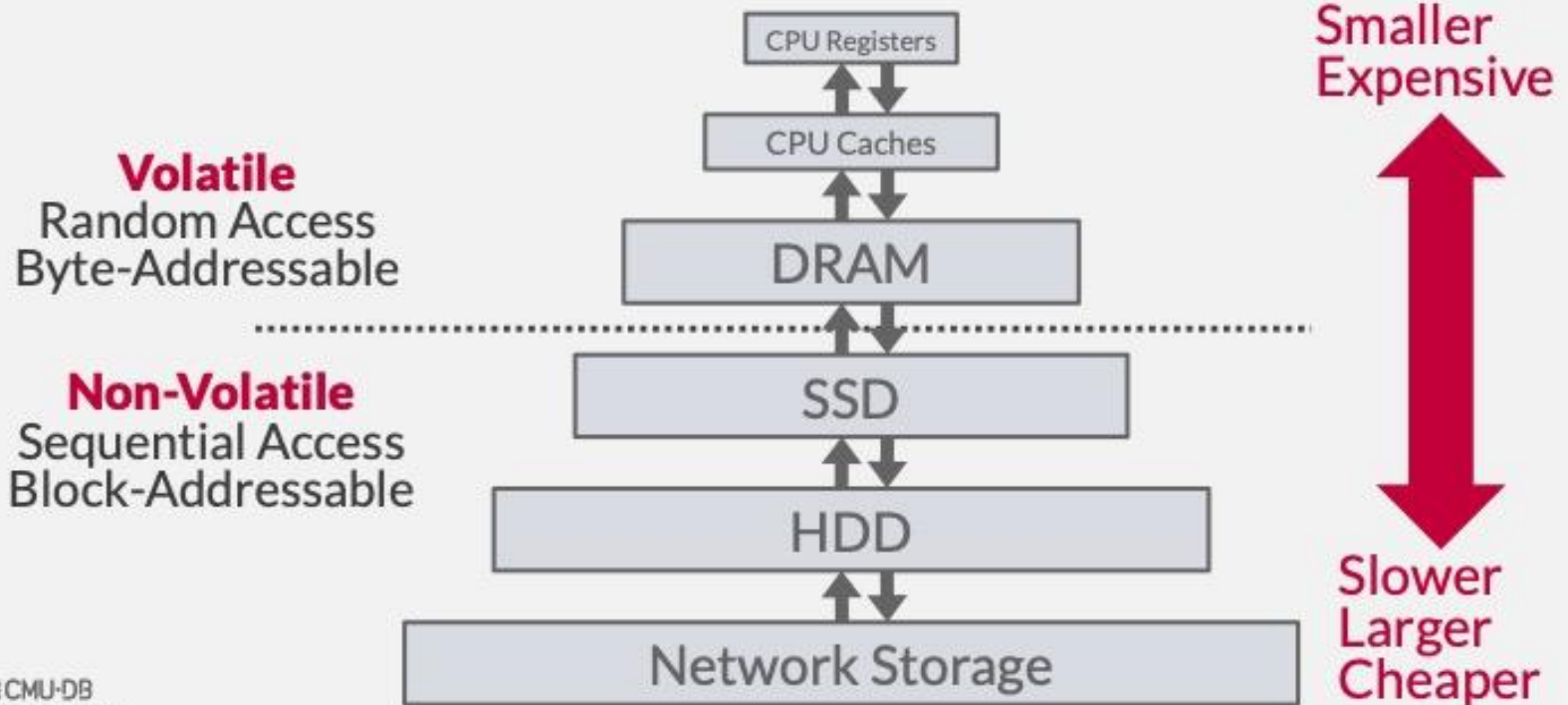
Storage Manager

Basics of Storage Methods

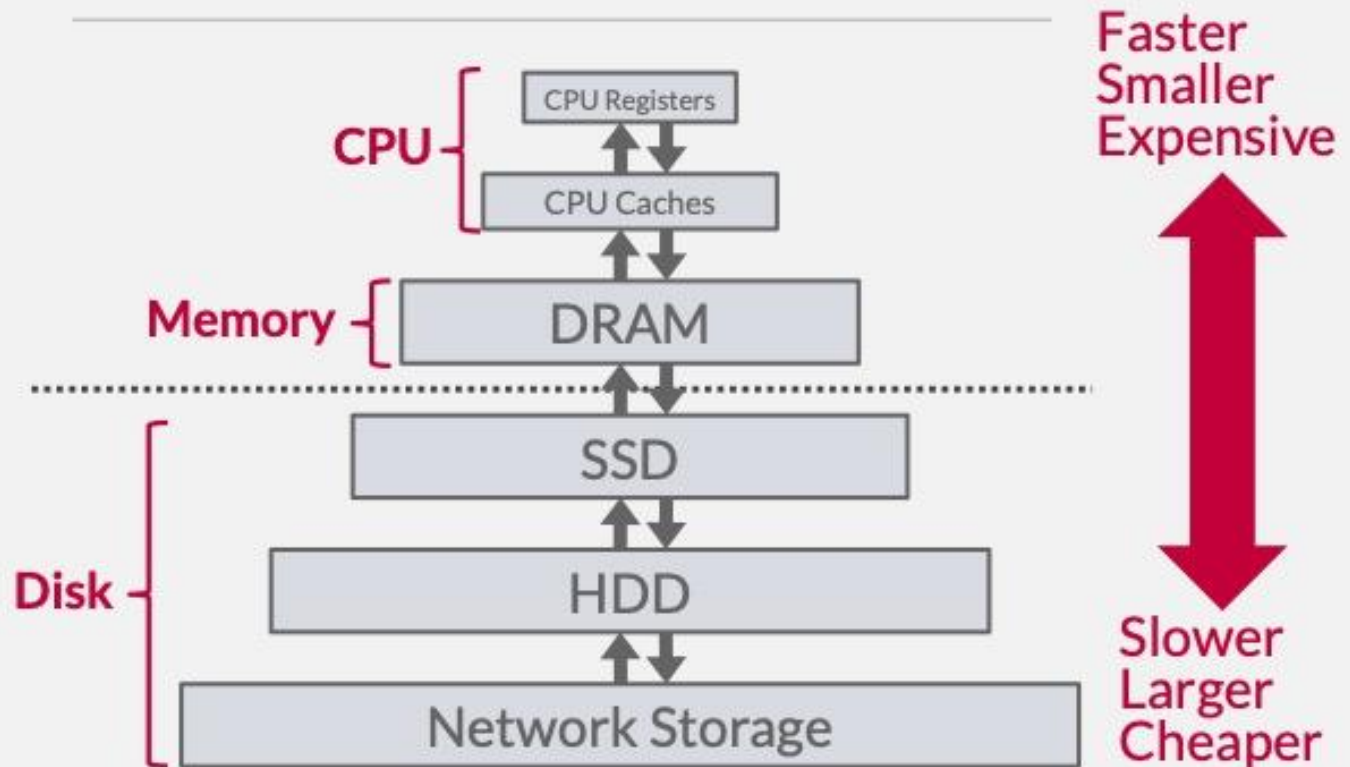
- Multiple storage layers: disk, main memory, cache, registers
- Each layer: an array of locations
- Location: word or page/block



STORAGE HIERARCHY



STORAGE HIERARCHY



ACCESS TIMES

Latency Numbers Every Programmer Should Know

1 ns	L1 Cache Ref
4 ns	L2 Cache Ref
100 ns	DRAM
16,000 ns	SSD
2,000,000 ns	HDD
~50,000,000 ns	Network Storage
1,000,000,000 ns	Tape Archives

ACCESS TIMES

Latency Numbers Every Programmer Should Know

1 ns L1 Cache Ref	← 1 sec
4 ns L2 Cache Ref	← 4 sec
100 ns DRAM	← 100 sec
16,000 ns SSD	← 4.4 hours
2,000,000 ns HDD	← 3.3 weeks
~50,000,000 ns Network Storage	← 1.5 years
1,000,000,000 ns Tape Archives	← 31.7 years

The Disk and the Buffer Pool

Disk

- Stores data persistently
- Different technologies:
 - Tapes: long-term archives
 - HDD: most today's data is stored here
 - SSD: your laptop, or cache for HDD
- Unit of Read/Write operation:
1 block = 0.5k .. 32k

Hard Drive Disk (HDD)

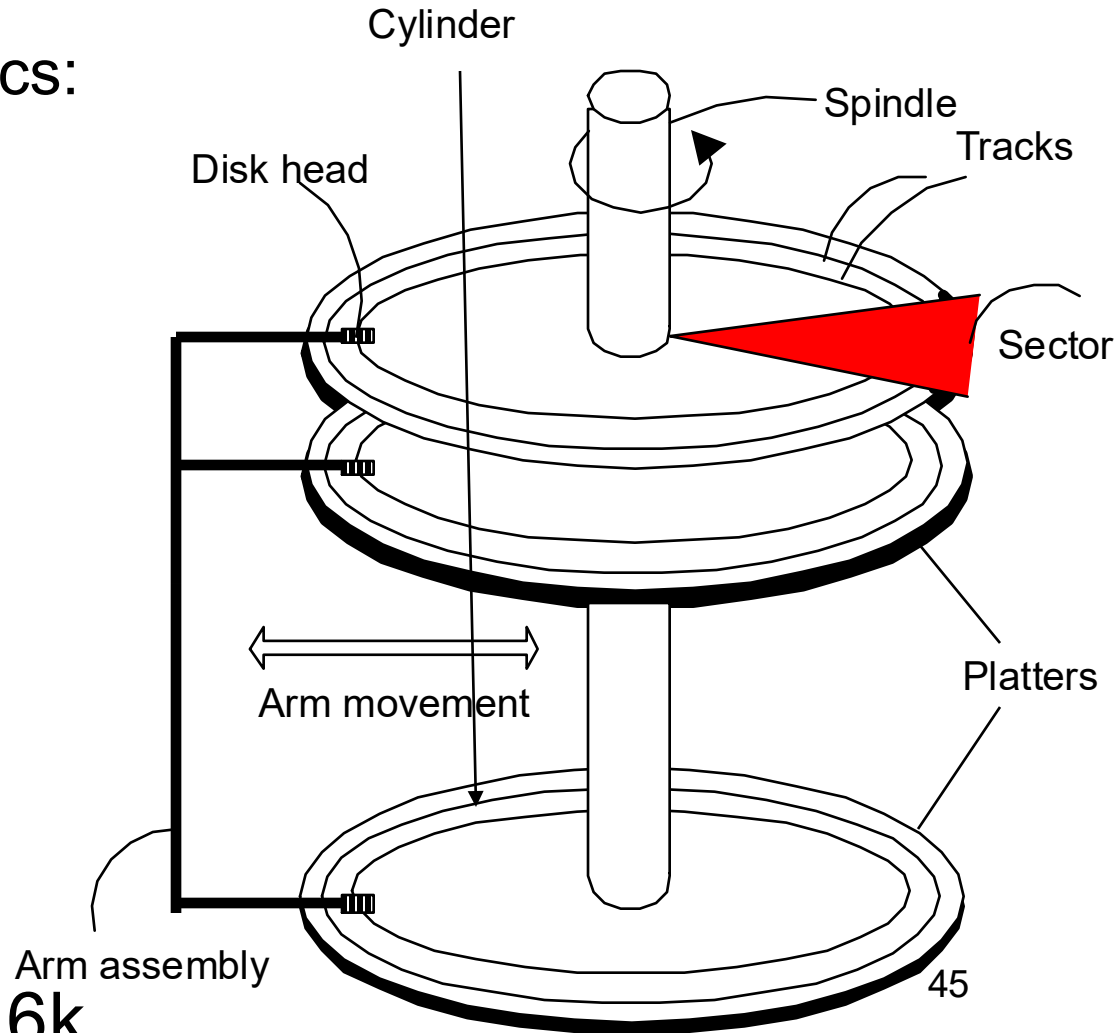
Mechanical characteristics:

- 5400 RPM
- 1-30 platters
- ≤ 10000 tracks
- 10^5 bytes/track

Unit of read or write:
disk block

Once in memory:
page

Typically: 4k or 8k or 16k



Disk Access Characteristics

- Disk latency
 - Seek time + rotational latency
- Seek time = time for head to reach cylinder
 - 10 – 40ms
- Rotational latency = time for sector to rotate
 - Rotation time = 10ms
 - Average latency = $10\text{ms} / 2$
- Transfer time = typically 40-80MB/s

Slow!

The Buffer Pool

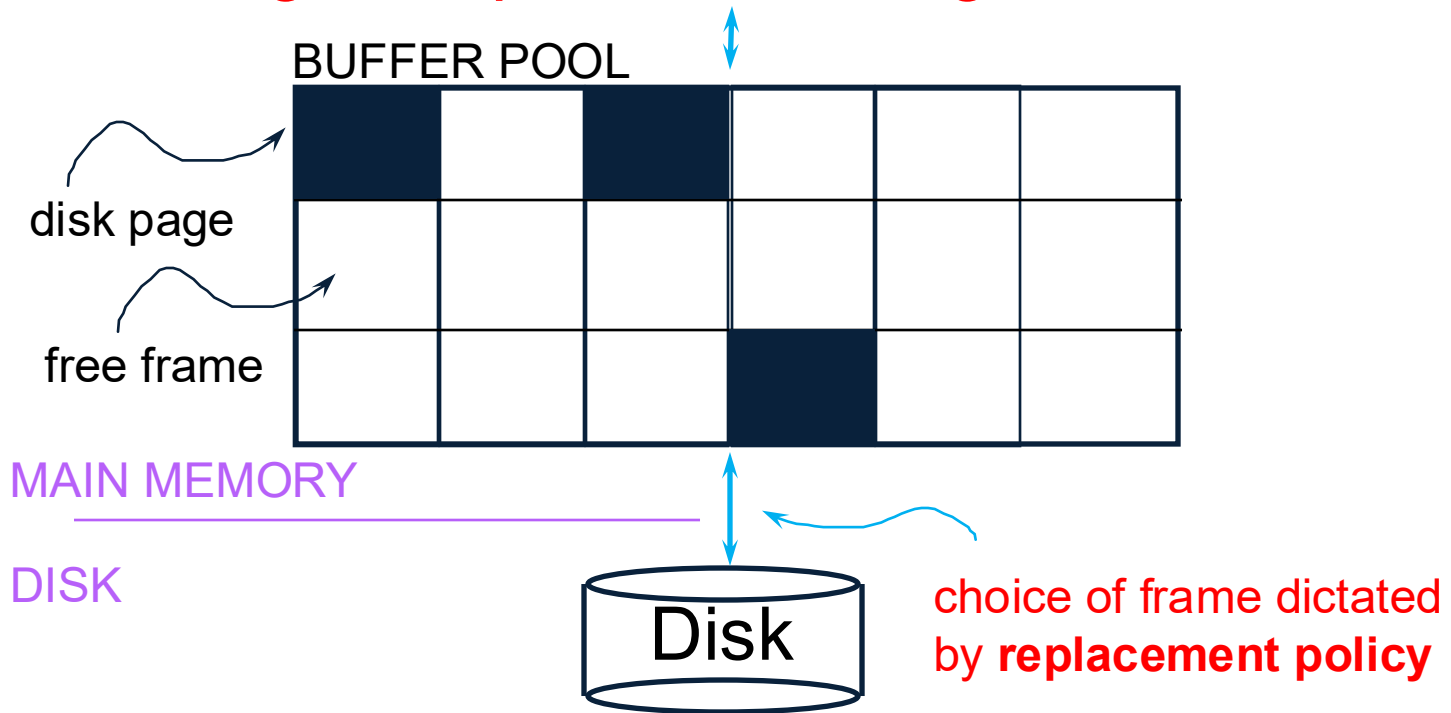
- Fixed chunk of main memory
- When a page is read from disk, it is brought to the buffer pool

The Buffer Pool

- Fixed chunk of main memory
- When a page is read from disk, it is brought to the buffer pool
- If same page is requested later, read it from the buffer pool: saves disk I/O
- If a new page is read, but no room in the buffer pool, one page is evicted

Buffer Manager

Page Requests from Higher Levels



- Table of <frame#, pageid> pairs

Buffer Manager

Needs a page replacement policy

- LRU: Least Recently Used (in class)
- Clock algorithm (on your own)

Terminology (Recap)

- Block:
 - Unit of memory accessed from disk
 - HW dependent: 8k or 16k or 32k or...
- Page:
 - Block content as it moves around
- Frame:
 - Fixed location in buffer to store a page

Storage Manager

Maps between the logical view of the data and the physical storage on disk

- Block#
- Page#
- Frame#

HW3!

Storage Manager

Modern DBMS use OS to create files

- 1 file = multiple (continuous?) blocks
today
- 1 block = multiple records, free space
next lecture

Storing Pages on Disk

Database file

Page 0

Page 1

Page 2

Page 3

Page 4

Database file

Page 5

Page 6

Page 7

Page 8

Page 9

Catalog of metadata: files, pages, records, free space

File Formats

File Formats

1. Sequential

2. Sorted

3. Index

1. Sequential File

Order of the records is unspecified

- Sequential access
- Random access

Sequential/Random Access

Sequential



Sequential/Random Access

Sequential



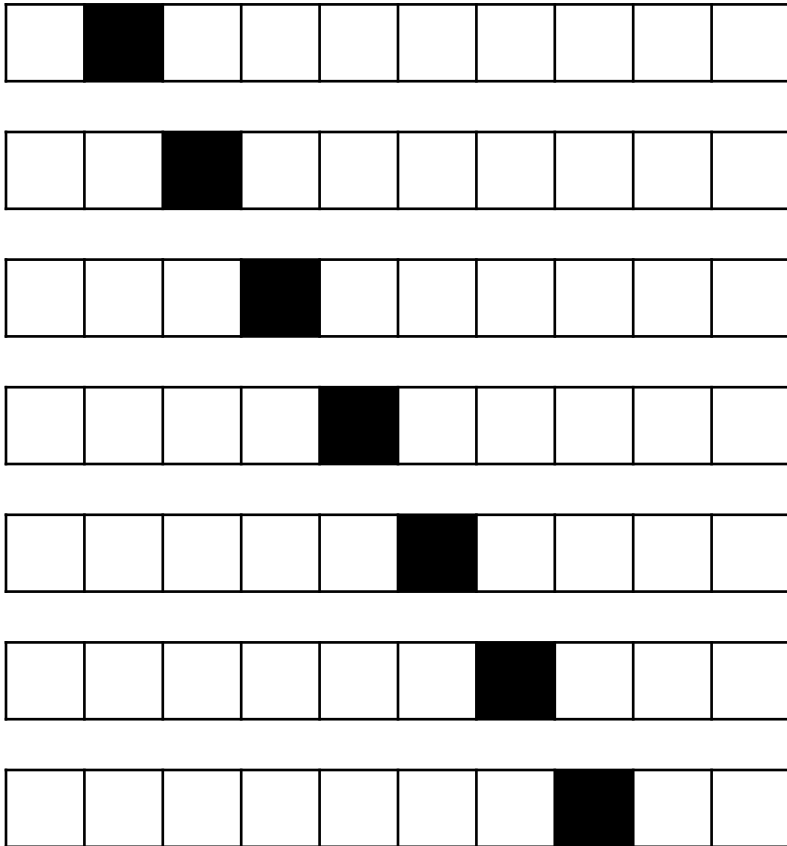
Sequential/Random Access

Sequential



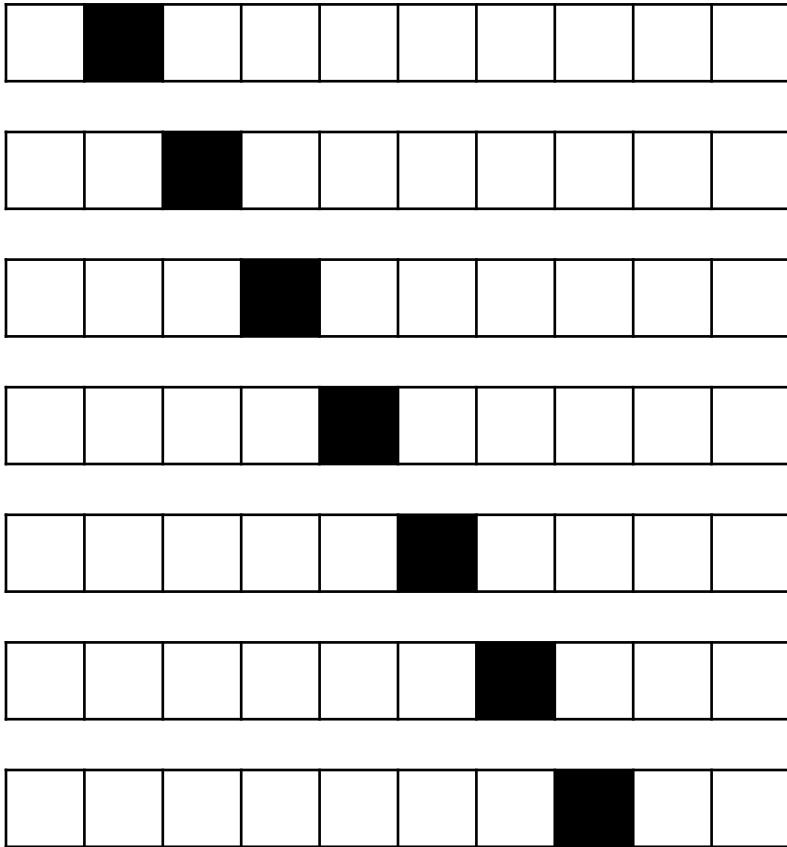
Sequential/Random Access

Sequential

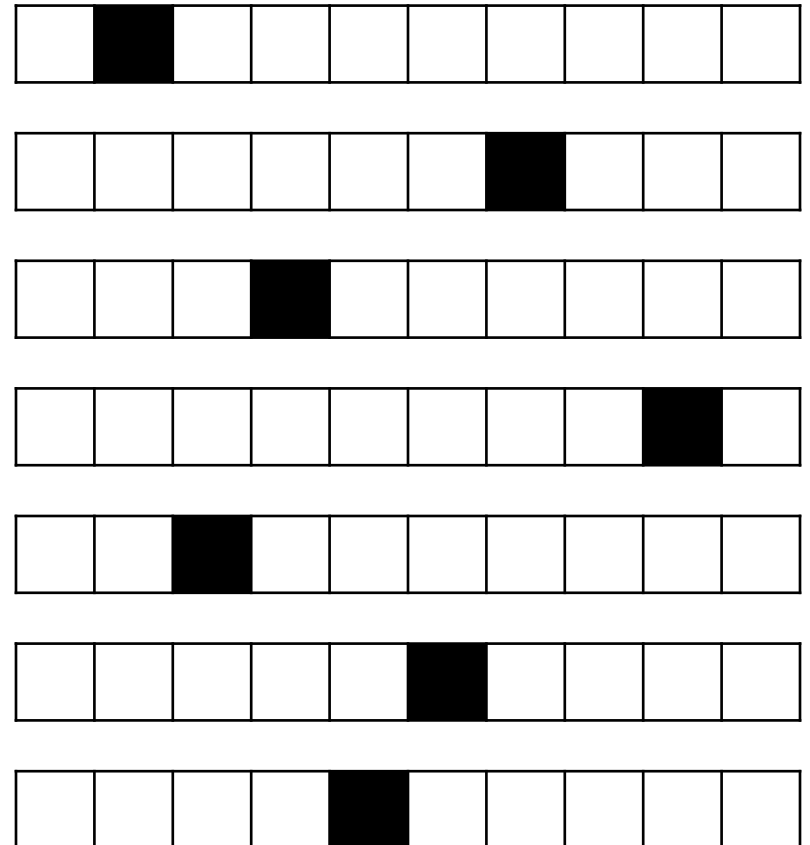


Sequential/Random Access

Sequential

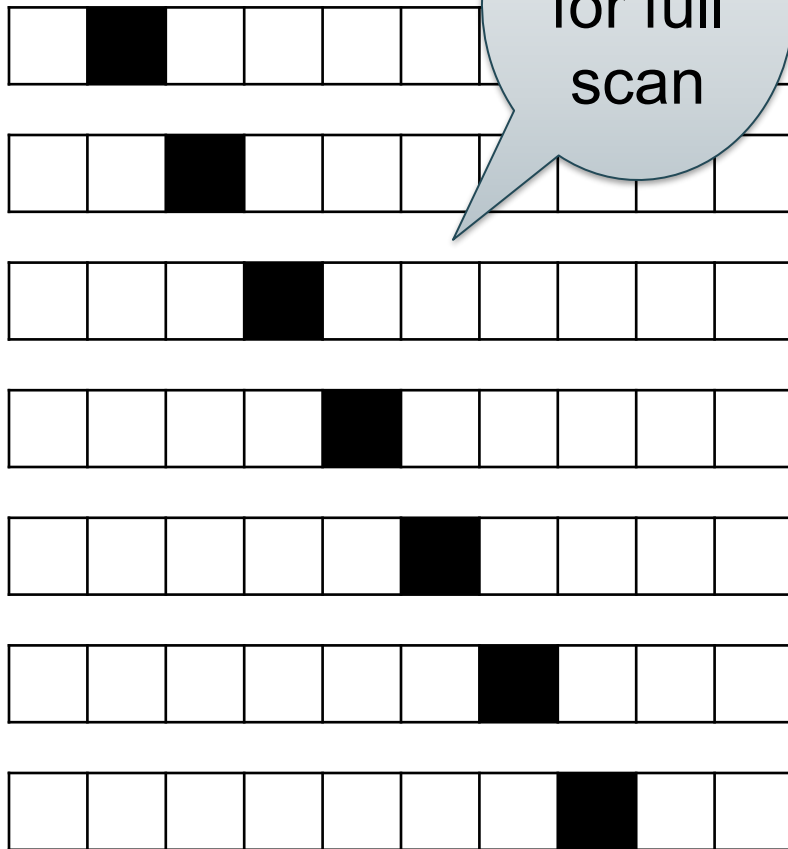


Random



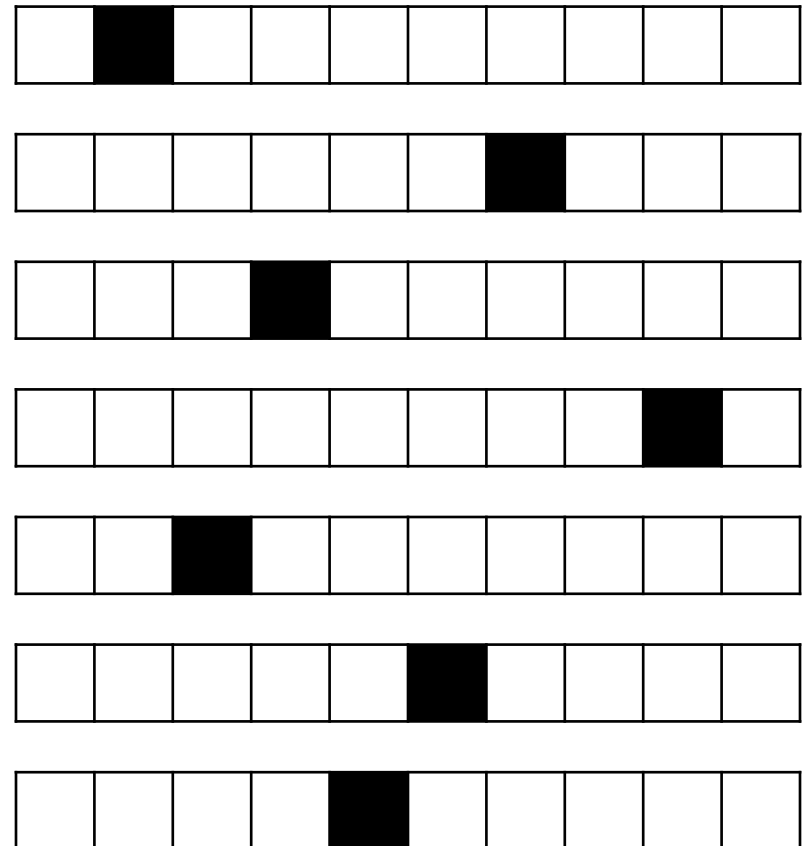
Sequential/Random Access

Sequential



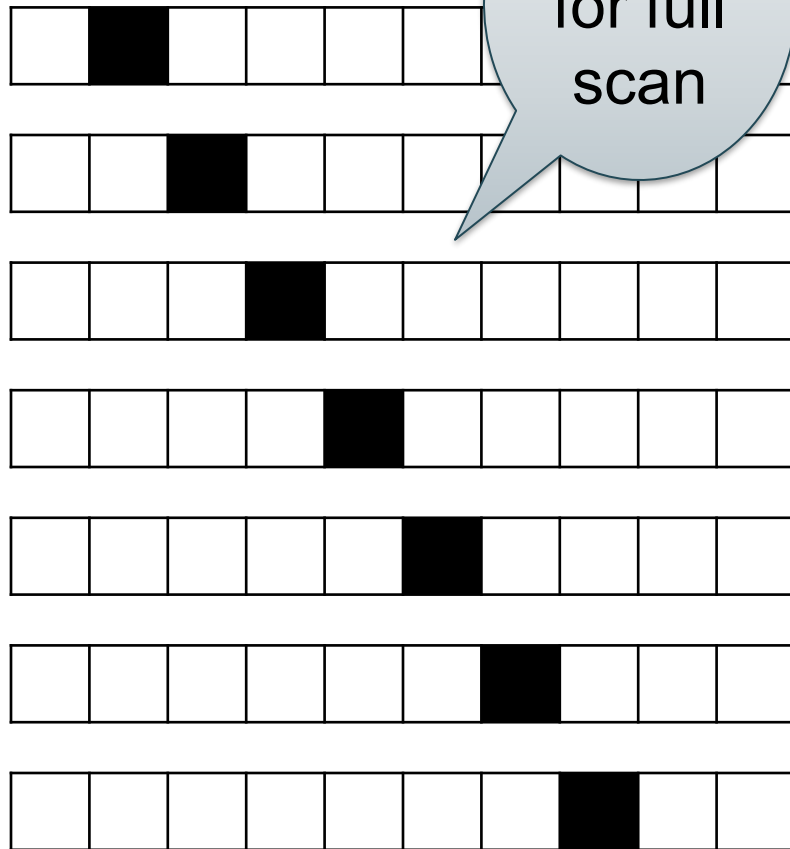
Faster
for full
scan

Random



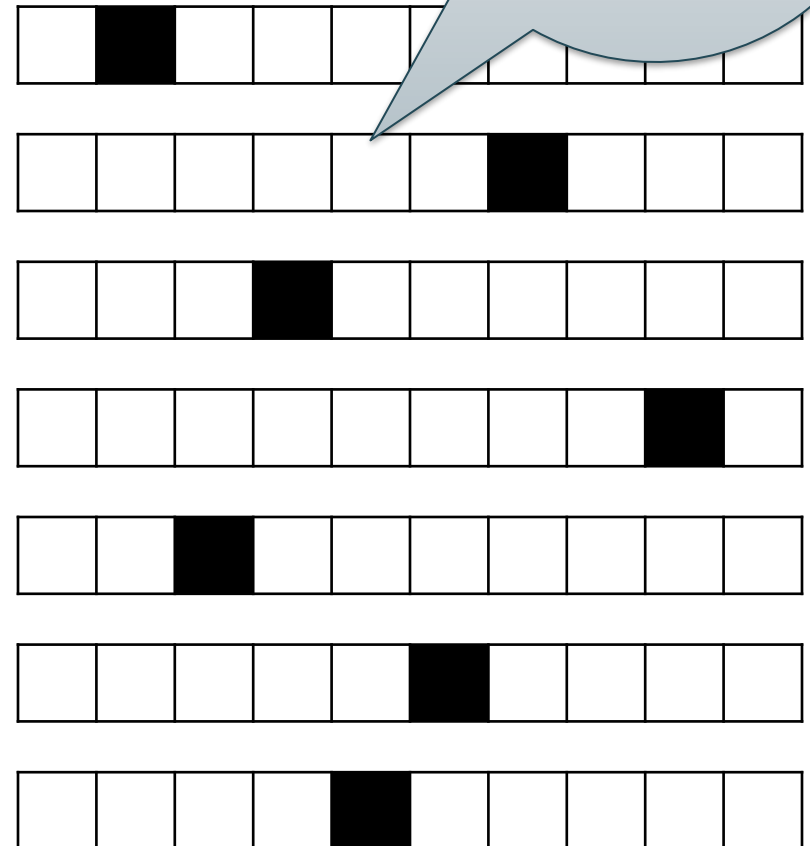
Sequential/Random Access

Sequential



Faster
for full
scan

Random



Faster
for direct
access to
few blocks

Sequential File: Summary

- Most common format for large data
- May add index file for direct access
- May sort for even faster access

2. Sorted File

- In addition to sequential/random search, we can also perform binary search

Binary Search

Sorted array:

12	24	31	37	42	48	52	59	61	66	69	75	88	92	95
----	----	----	----	----	----	----	----	----	----	----	----	----	----	----

Binary Search

Sorted array:

12	24	31	37	42	48	52	59	61	66	69	75	88	92	95
----	----	----	----	----	----	----	----	----	----	----	----	----	----	----

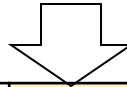
Find 42

Binary Search

Sorted array:

12	24	31	37	42	48	52	59	61	66	69	75	88	92	95
----	----	----	----	----	----	----	----	----	----	----	----	----	----	----

Find 42



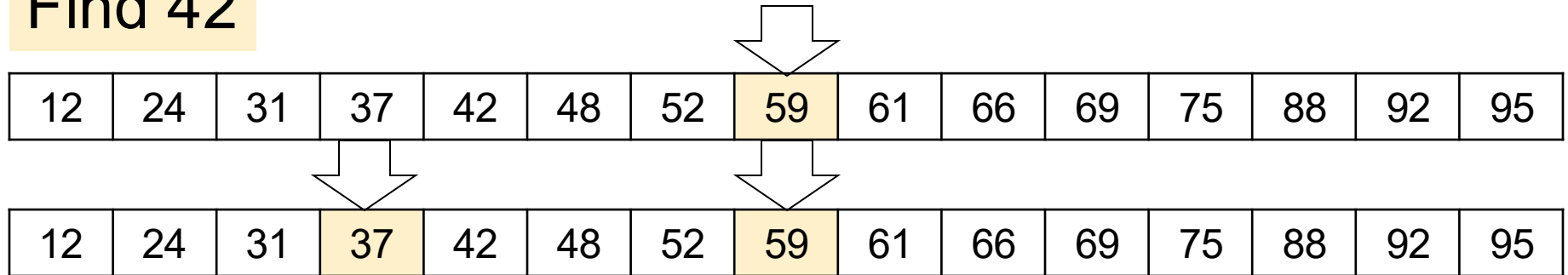
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Binary Search

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12	24	31	37	42	48	52	59	61	66	69	75	88	92	95
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Find 42



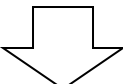
Binary Search

Sorted array:

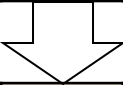
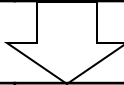
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----	----	----	----	----	----	----	----	----	----	----	----	----	----	----

Find 42

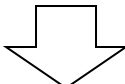
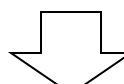
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----	----	----	----	----	----	----	----	----	----	----	----	----	----	----



12	24	31	37	42	48	52	59	61	66	69	75	88	92	95
----	----	----	----	----	----	----	----	----	----	----	----	----	----	----



12	24	31	37	42	48	52	59	61	66	69	75	88	92	95
----	----	----	----	----	----	----	----	----	----	----	----	----	----	----

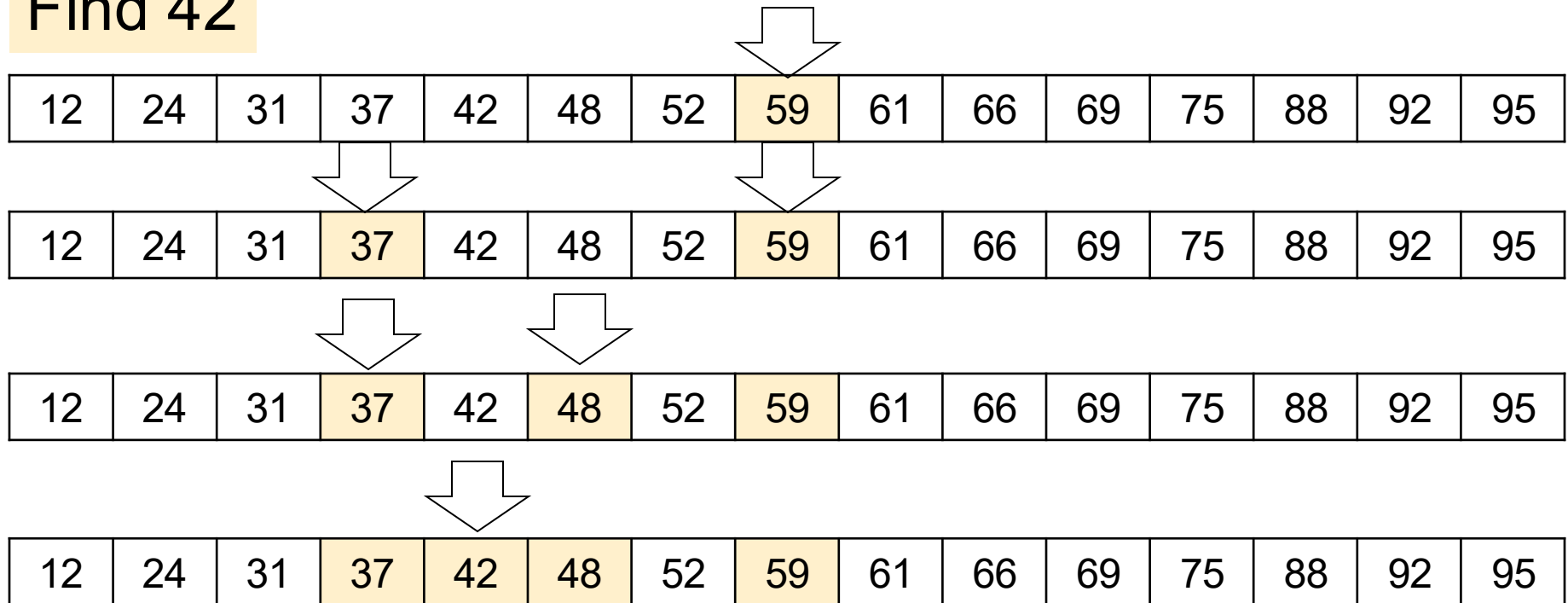


Binary Search

Sorted array:

12	24	31	37	42	48	52	59	61	66	69	75	88	92	95
----	----	----	----	----	----	----	----	----	----	----	----	----	----	----

Find 42



Binary Search

- $\log N$ comparisons
- Any algorithm needs $\log N$

Binary Search

- $\log N$ comparisons
- Any algorithm needs $\log N$
- Ex. $N = 1,000,000,000$
 - Sequential search: $\approx 500,000,000$ steps
 - Binary search: 30 steps

Binary Search

- $\log N$ comparisons
- Any algorithm needs $\log N$
- Ex. $N = 1,000,000,000$
 - Sequential search: $\approx 500,000,000$ steps
 - Binary search: 30 steps

Sorted array + binary search = optimal!

Binary Search On Disk

Page 0				Page 1				Page 2				Page 3		
12	24	31	37	42	48	52	59	61	66	69	75	88	92	95

What problem do you see?

Binary Search On Disk

Page 0				Page 1				Page 2				Page 3		
12	24	31	37	42	48	52	59	61	66	69	75	88	92	95

What problem do you see?

Read one page, use only one key!

Solution? Wait for it!

Binary Search

Assume array is in main memory

Problem: updates with poor performance

- Insert: shift $O(N)$ items to the right
- Delete: shift $O(N)$ items to the left

Insert/Delete

12	24	31	37	42	48	52	59	61	66	69	75
----	----	----	----	----	----	----	----	----	----	----	----

Insert/Delete

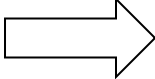
12	24	31	37	42	48	52	59	61	66	69	75
----	----	----	----	----	----	----	----	----	----	----	----

Insert 45

Insert/Delete

12	24	31	37	42	48	52	59	61	66	69	75
----	----	----	----	----	----	----	----	----	----	----	----

Insert 45

 shift

12	24	31	37	42		48	52	59	61	66	69	75
----	----	----	----	----	--	----	----	----	----	----	----	----

Insert/Delete

12	24	31	37	42	48	52	59	61	66	69	75
----	----	----	----	----	----	----	----	----	----	----	----

Insert 45



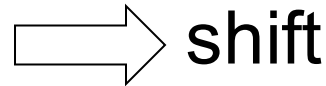
12	24	31	37	42		48	52	59	61	66	69	75
----	----	----	----	----	--	----	----	----	----	----	----	----

12	24	31	37	42	45	48	52	59	61	66	69	75
----	----	----	----	----	----	----	----	----	----	----	----	----

Insert/Delete

12	24	31	37	42	48	52	59	61	66	69	75
----	----	----	----	----	----	----	----	----	----	----	----

Insert 45



12	24	31	37	42		48	52	59	61	66	69	75
----	----	----	----	----	--	----	----	----	----	----	----	----

12	24	31	37	42	45	48	52	59	61	66	69	75
----	----	----	----	----	----	----	----	----	----	----	----	----

Delete 31

...

Sorted File: Summary

- Advantage: Fast lookup
- Disadvantage:
 - Updates need separate logic (B+ trees)
 - Can only sort on one attribute
- Terminology: the file is *clustered*

3. Index File

- File supports efficient lookup + update
- In class: B+ trees, Hash tables
- Other index structures: R-trees, inverted indexes, bitmaps, ...

Review: Search Tree

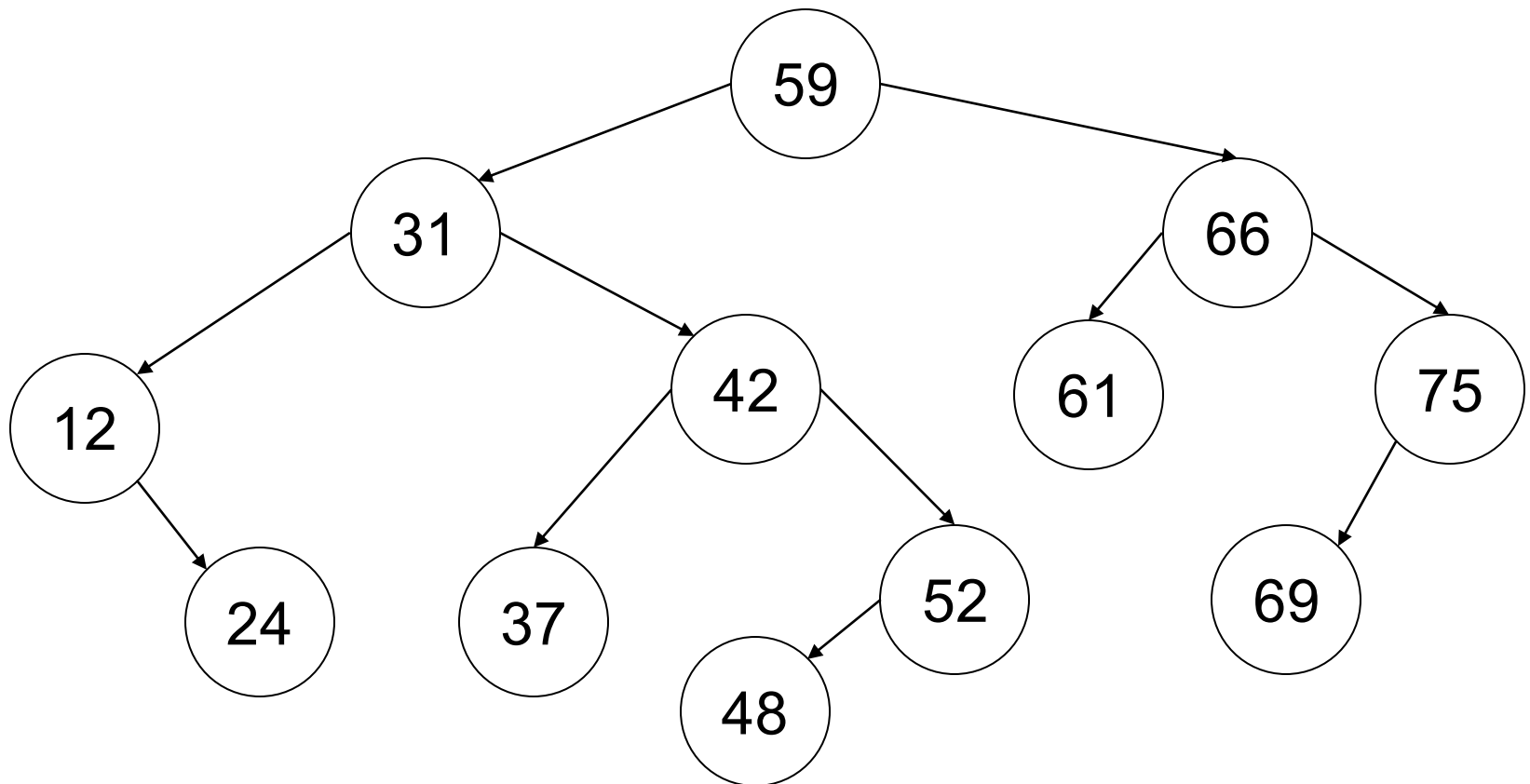
- Updating a sorted file/array is inefficient
- Standard work-around in CS is to replace the sorted file with a **search tree**
- Next: brief review of binary search trees

Review: Binary Search Tree

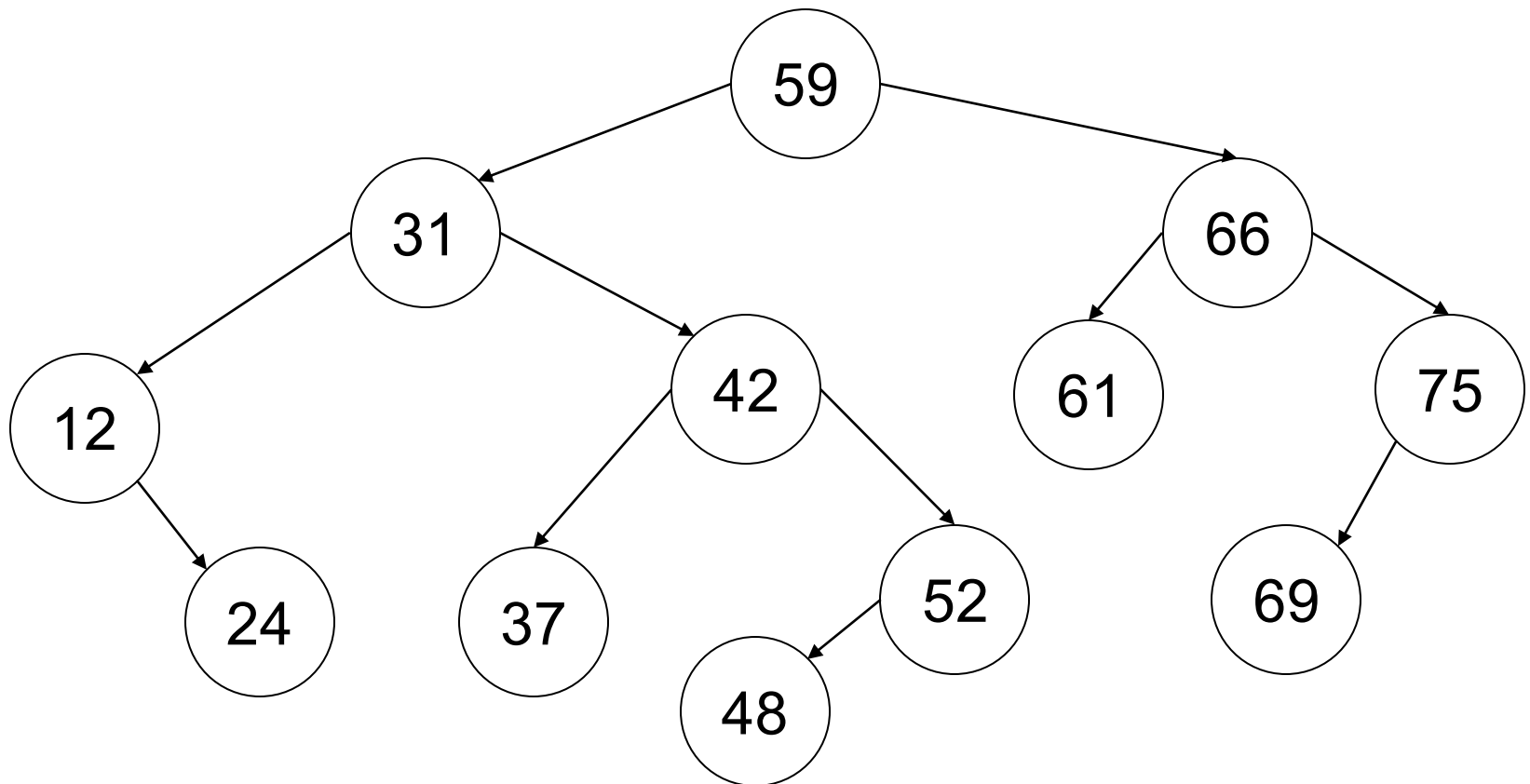
12	24	31	37	42	48	52	59	61	66	69	75
----	----	----	----	----	----	----	----	----	----	----	----

Review: Binary Search Tree

12	24	31	37	42	48	52	59	61	66	69	75
----	----	----	----	----	----	----	----	----	----	----	----

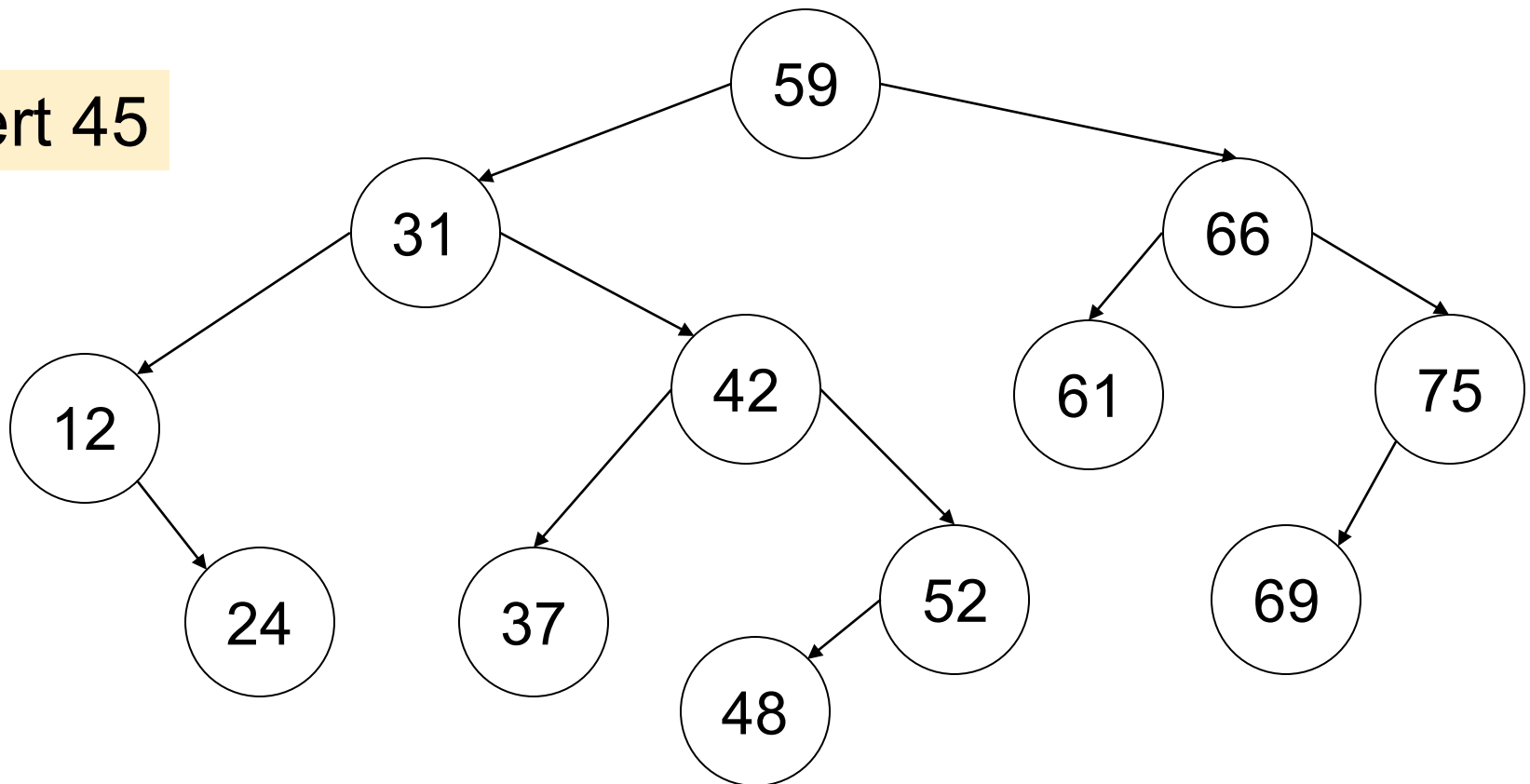


Review: Binary Search Tree



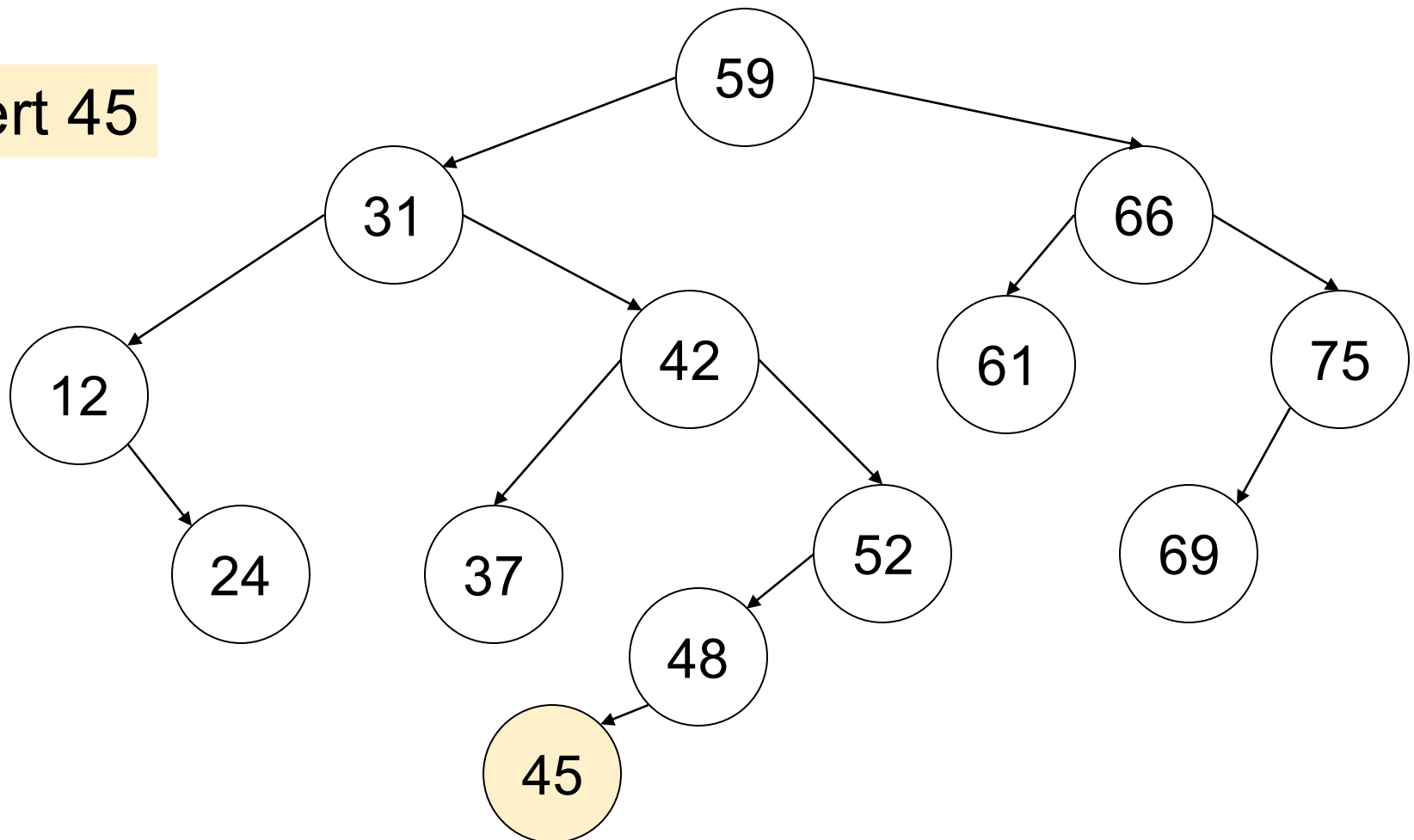
Review: Binary Search Tree

Insert 45



Review: Binary Search Tree

Insert 45



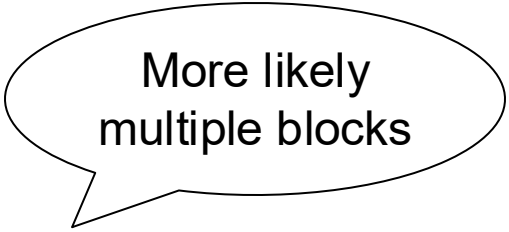
Review: Binary Search Tree

- Need to be balanced: $\text{depth} = O(\log N)$
- Various methods to rebalance:
 - Red/black trees, splay trees, ...
- Time for search/insert/delete = $O(\log N)$

But not good for disk

-- why??

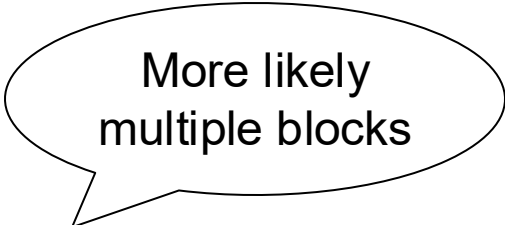
B+ Trees



More likely
multiple blocks

- Idea in B Trees
 - Make 1 node = 1 page (= 1 block)
 - Store multiple keys and children
 - Read 1 page, use many keys

B+ Trees

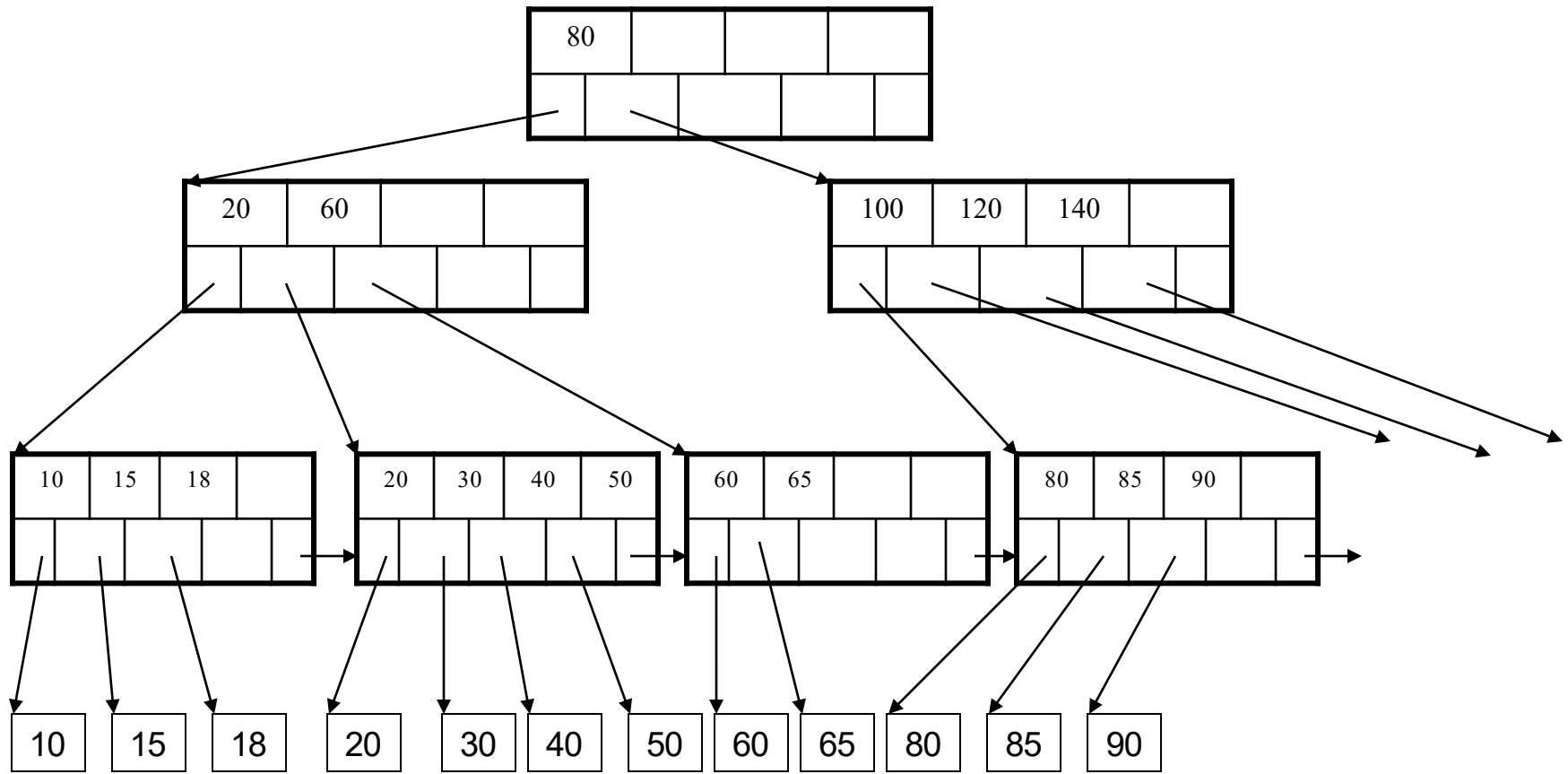


More likely
multiple blocks

- Idea in B Trees
 - Make 1 node = 1 page (= 1 block)
 - Store multiple keys and children
 - Read 1 page, use many keys
- Idea in B+ Trees
 - Keys are stored only on leaves
 - Internal nodes used only for guiding
 - Leaves are linked in a list, for range queries

B+ Tree Example

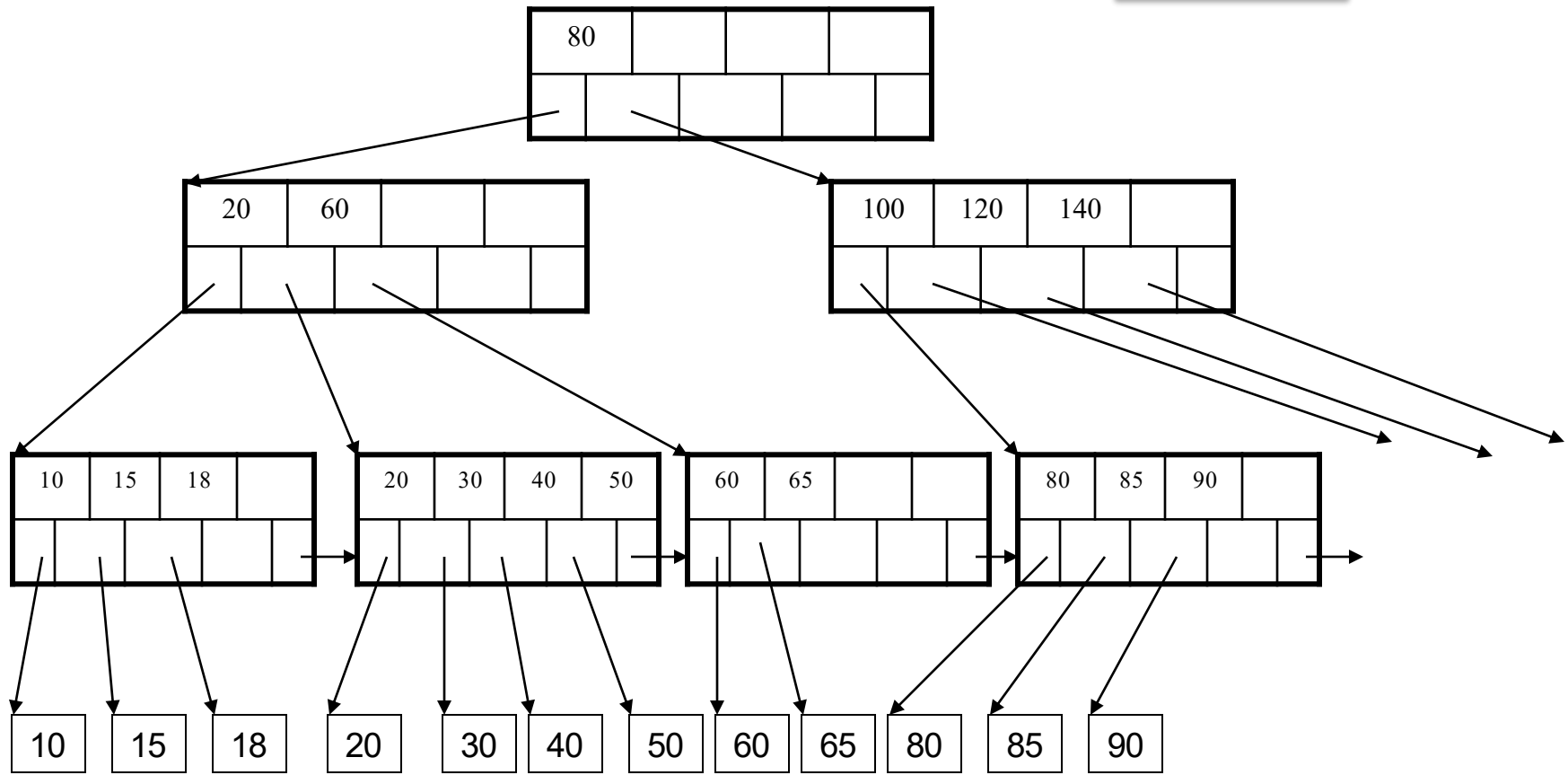
$d = 2$



B+ Tree Example

$d = 2$

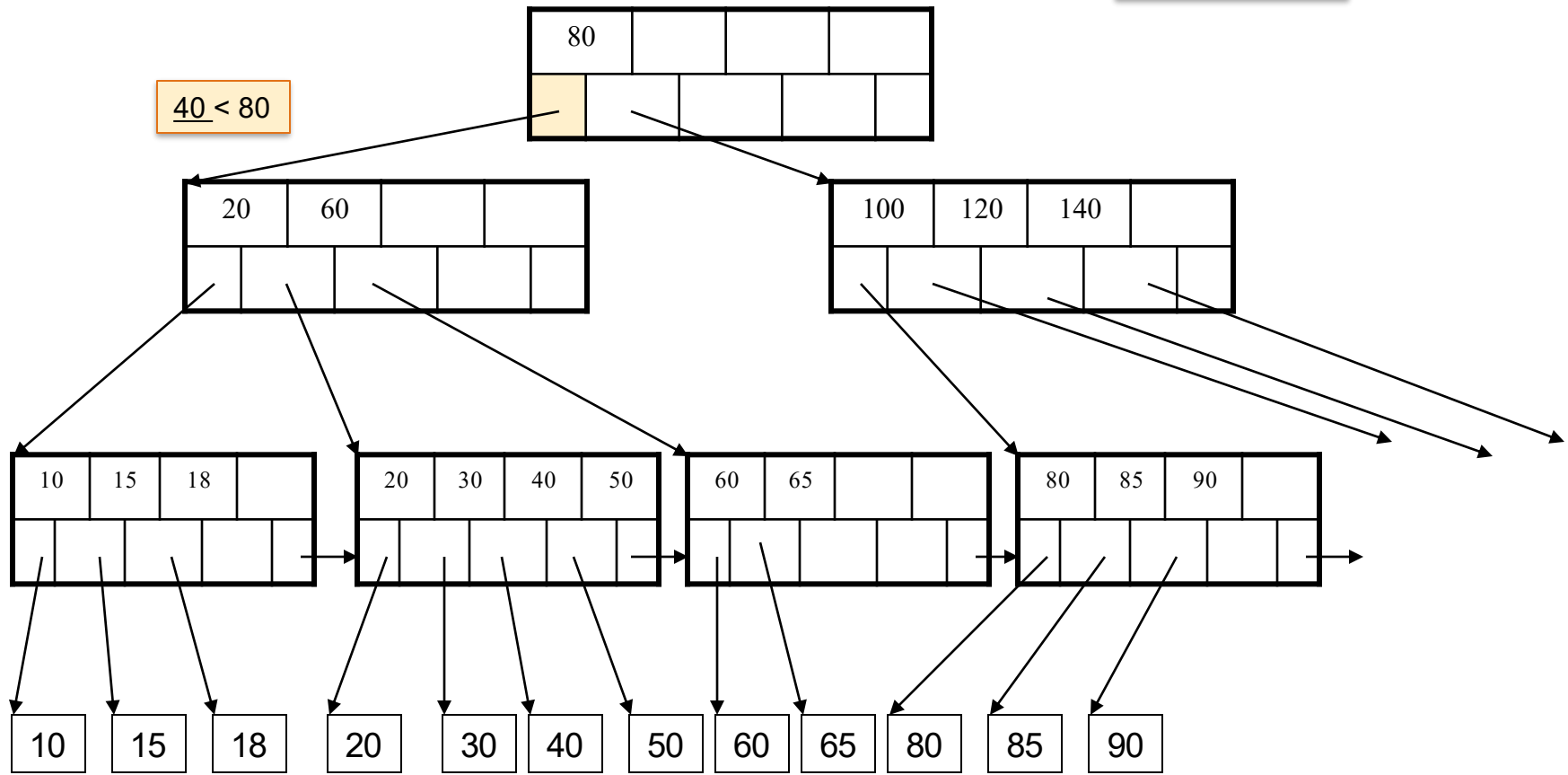
Find the key 40



B+ Tree Example

$d = 2$

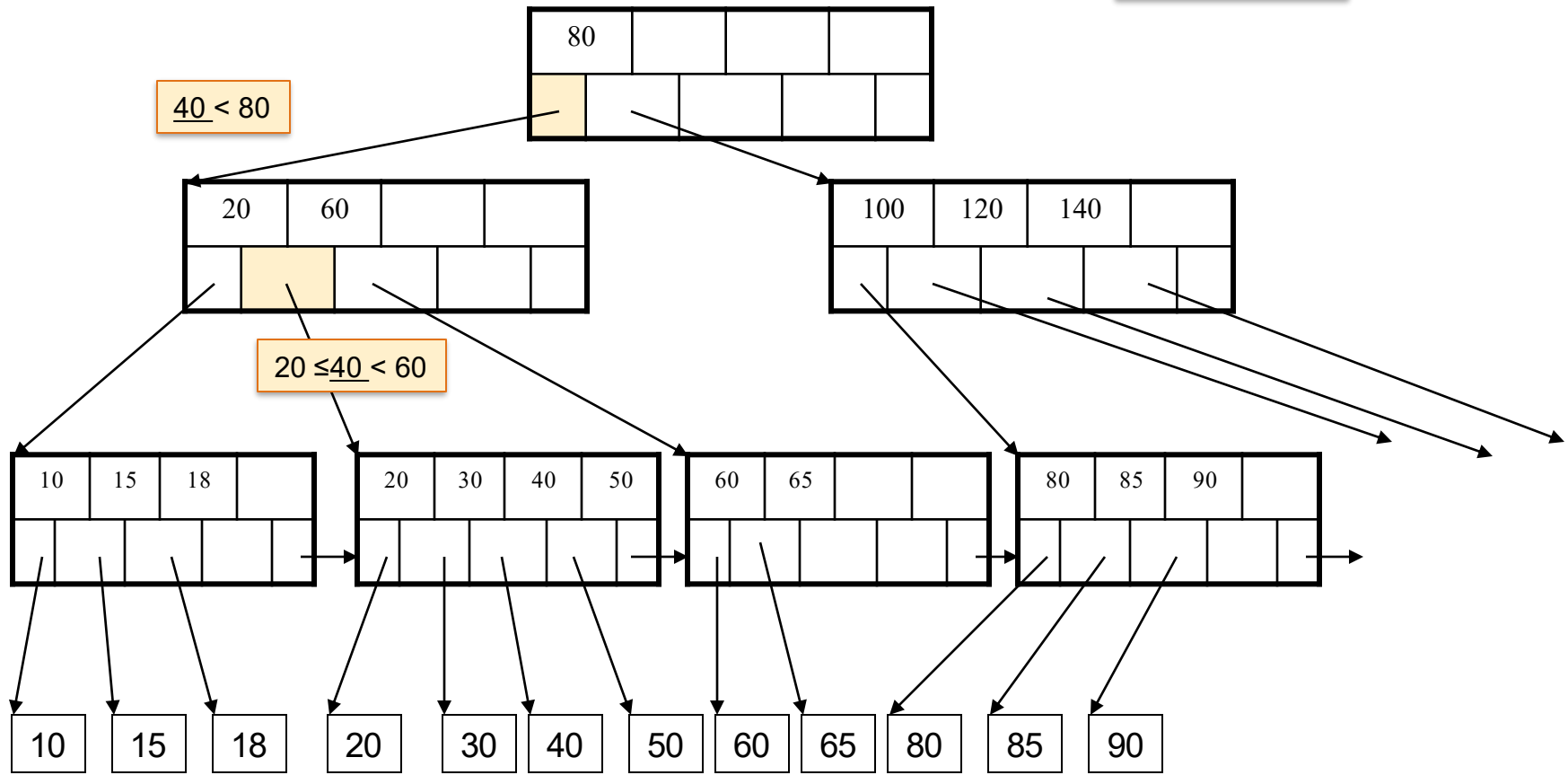
Find the key 40



B+ Tree Example

$d = 2$

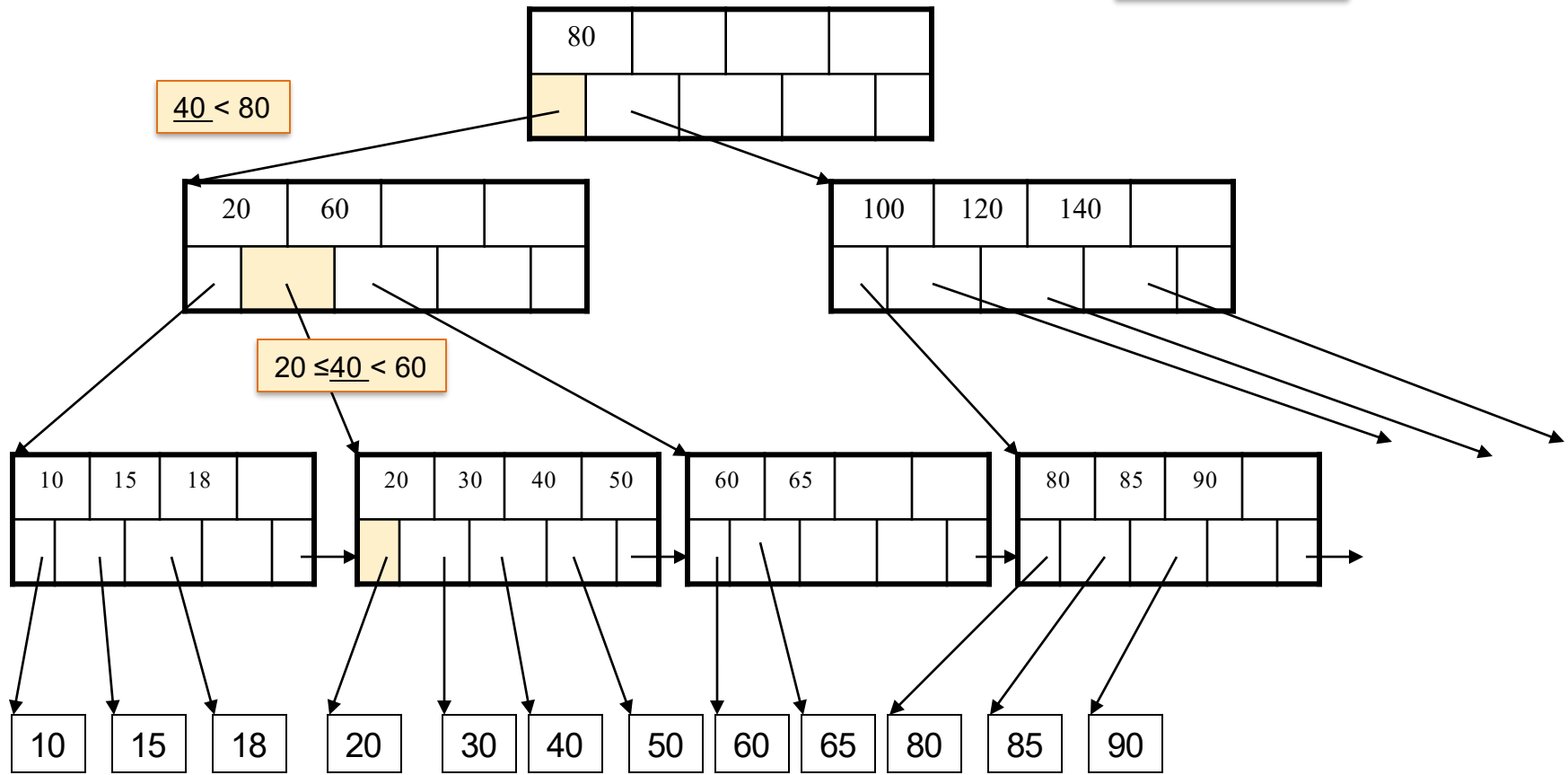
Find the key 40



B+ Tree Example

$d = 2$

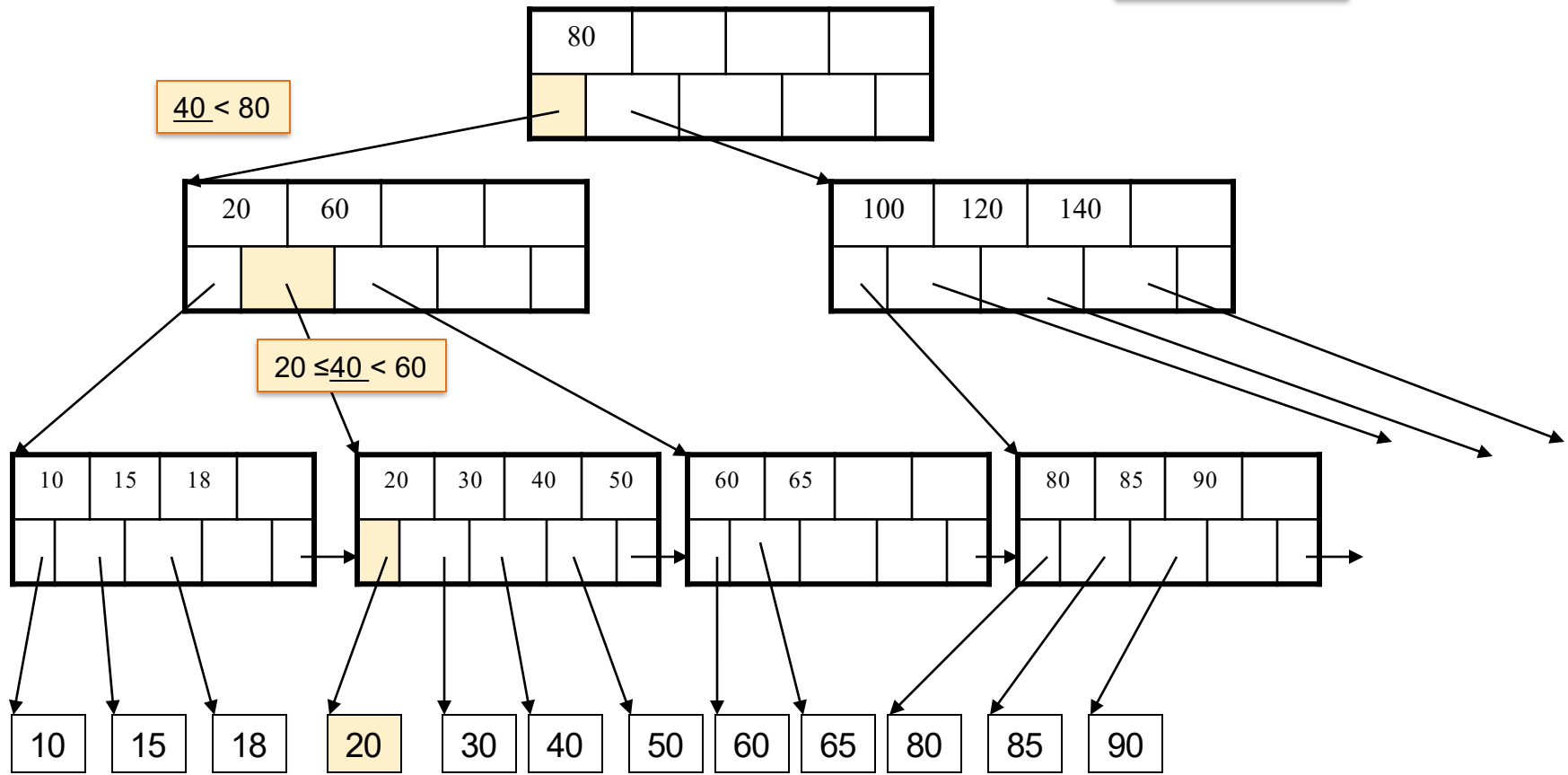
Find the key 40



B+ Tree Example

$d = 2$

Find the key 40



Recap: File Formats

1. Sequential
2. Sorted
3. Index: will discuss more next lecture

Summary of Storage Manager

- Storage manager and buffer manager are a significant component of DBMS
- Key for good performance
- They also need to handle transactions, which we will not cover in 544