

**We'll start with a summary of RAID**

**Then cover table & buffer  
management**

We will start at 2:10 pm

## Changes in schedule to better fit project

03	Week 3: Indexing with Hash Tables and B-Trees
04	Week 4: Write-Optimized Indexing
05	Week 5: External Sorting
06	Week 6: Column-Stores

Send me whichever groups have formed

Mail [nivdayan@gmail.com](mailto:nivdayan@gmail.com)

11 groups contacted me already

My [cs.toronto.edu](mailto:cs.toronto.edu) email does  
not seem to be receiving all  
emails

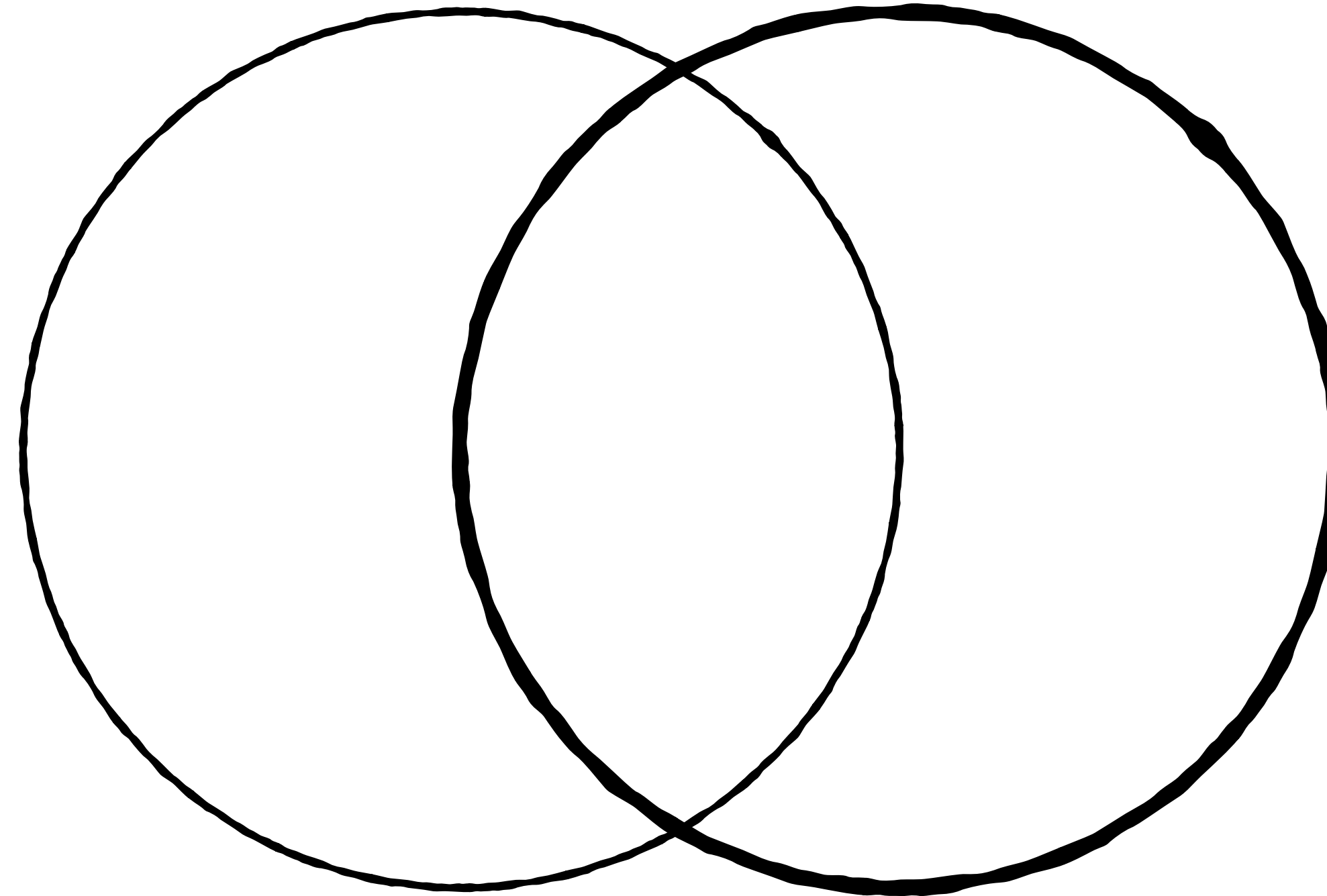
## **This week's tutorial**

Exercise session

Relevant for midterm/final

**Textbook**

**Slides**

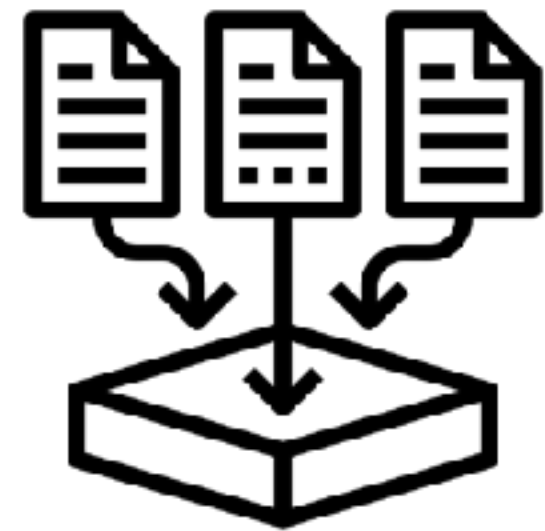


**There to solidify your  
understanding and get  
a historical perspective.**

**Only material in the  
slides will appear in the  
midterm/exam**

# RAID Addresses Three Problems

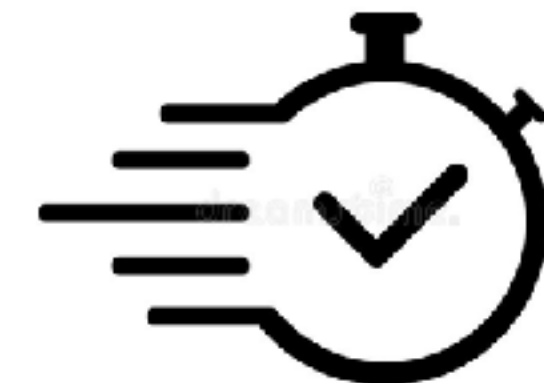
**Our database size exceeds one drive and we need more storage**



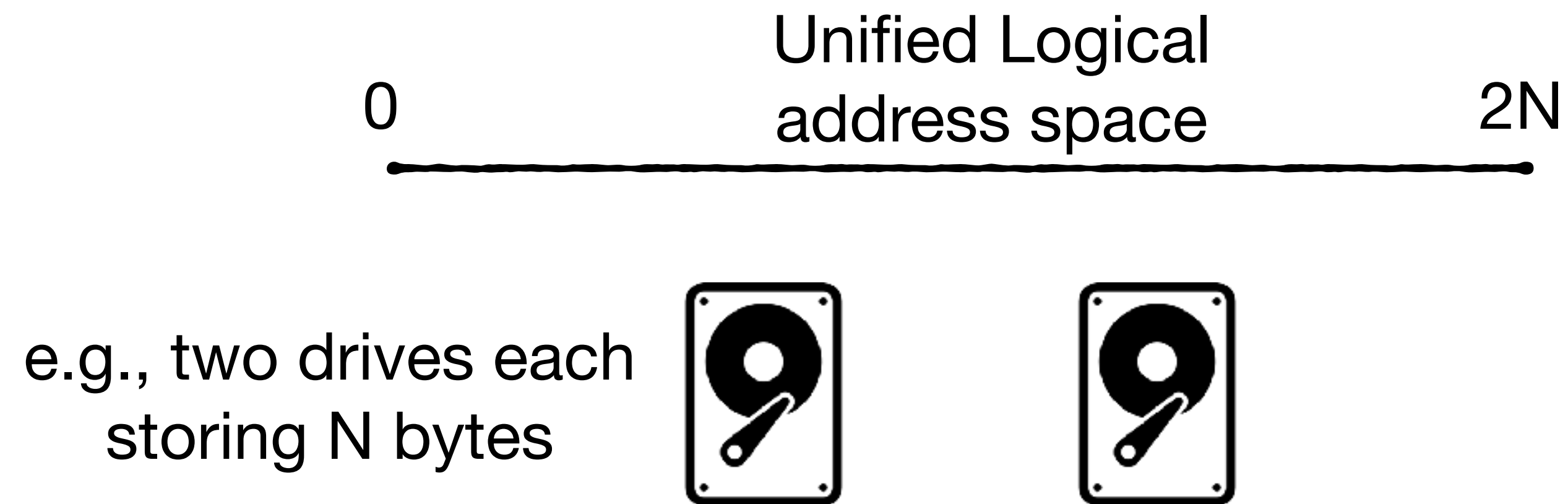
**A drive fails, and we need to recover its data**



**We want to overcome the limits of one storage device speed**



## Expose a larger logical address space to OS



**Looks to the OS like one drive, though consists of many**

# The spectrum of RAID designs

**RAID 0**

**RAID 1**

**RAID 0+1**

**RAID 4**

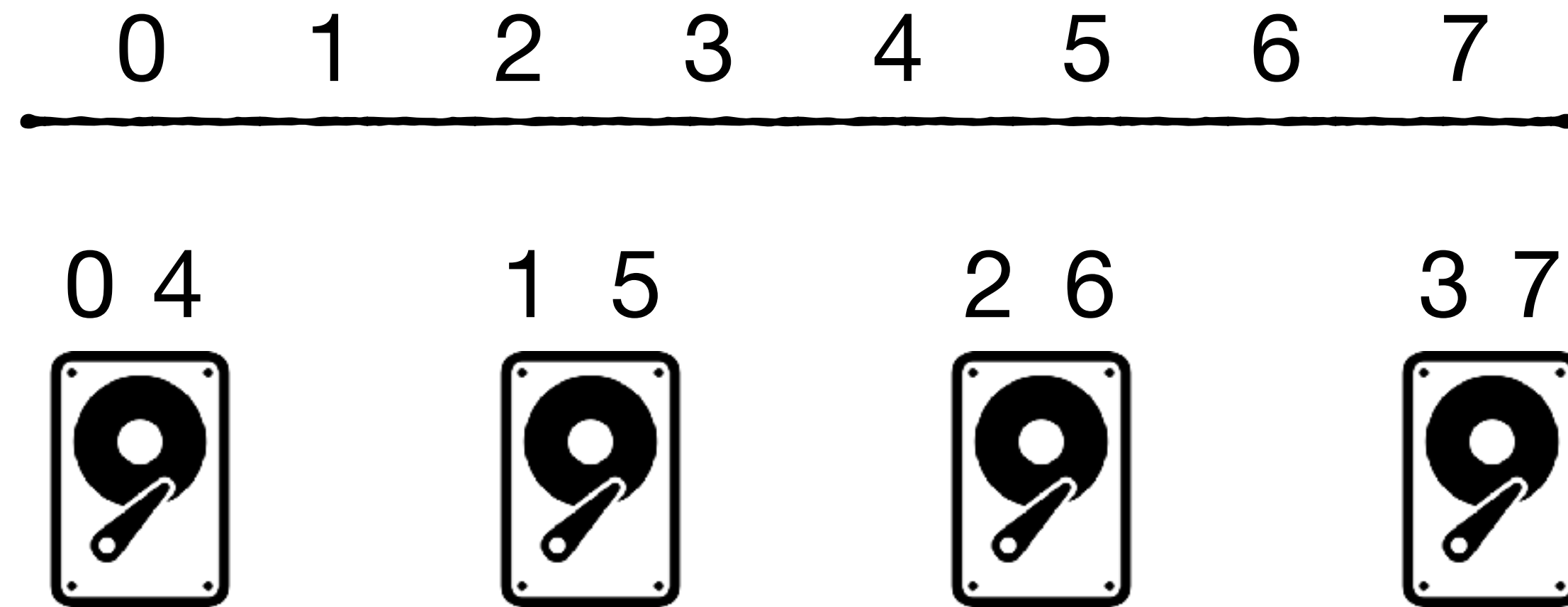
**RAID 5**

**RAID 6**



## RAID 0 - Pure striping

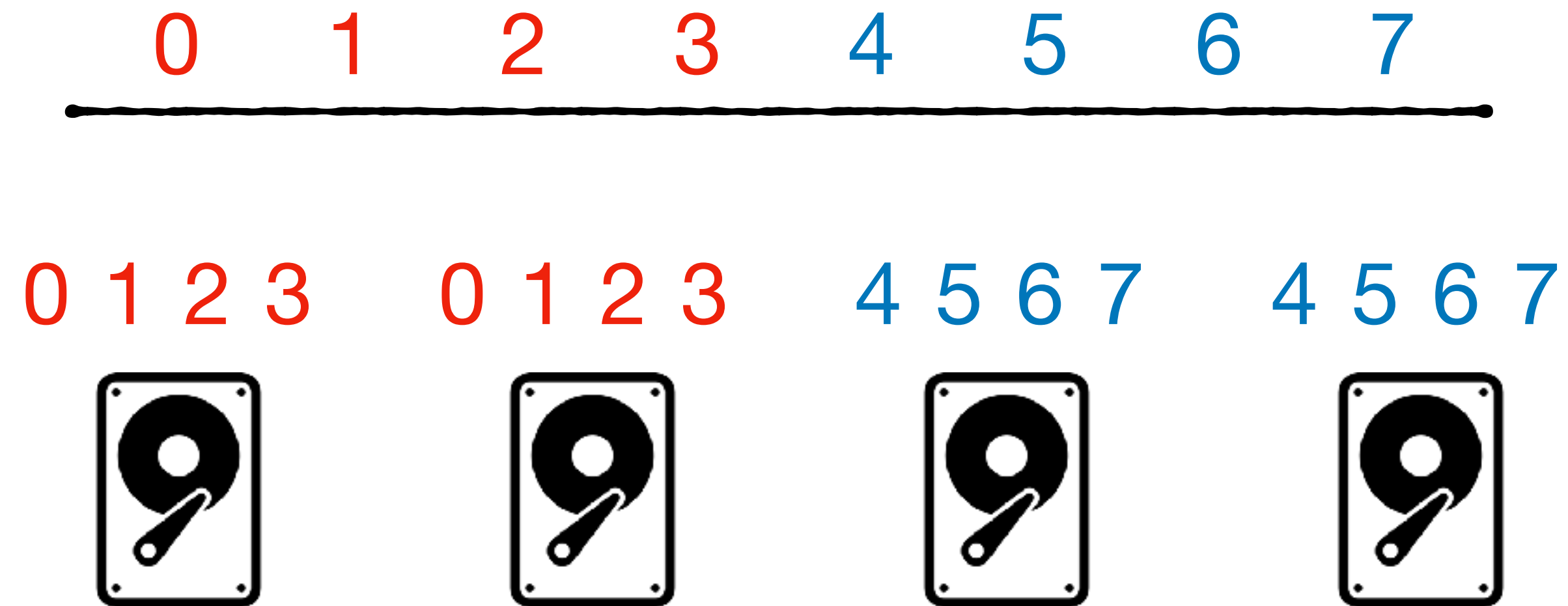
Stripe data in the logical address



1. Much faster sequential writes and reads
2. Also improvement for random writes and reads due to load balancing
3. No redundancy. If one disk fails, we lose data.

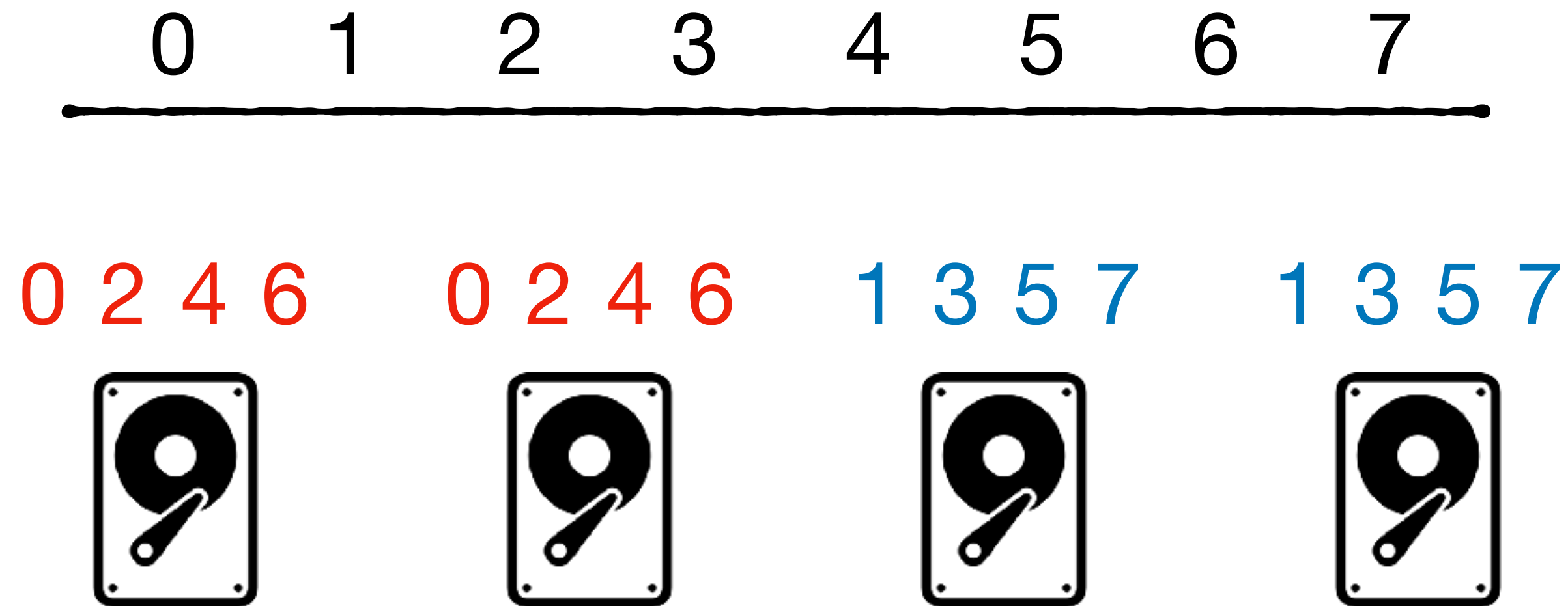
# RAID 1 - Mirroring

Each drive has one mirror



1. Slower writes as they must make 2 copies
2. Faster reads as we have a choice to read from a non-busy drive
3. Allows recovery of a disk but costs 50% of storage capacity

## RAID 0+1 - Striping and Mirroring



1. Faster sequential reads and writes as they are more distributed
2. Writes still require making two copies, and reads still have flexibility
3. Still requires 50% of storage capacity

RAID 0

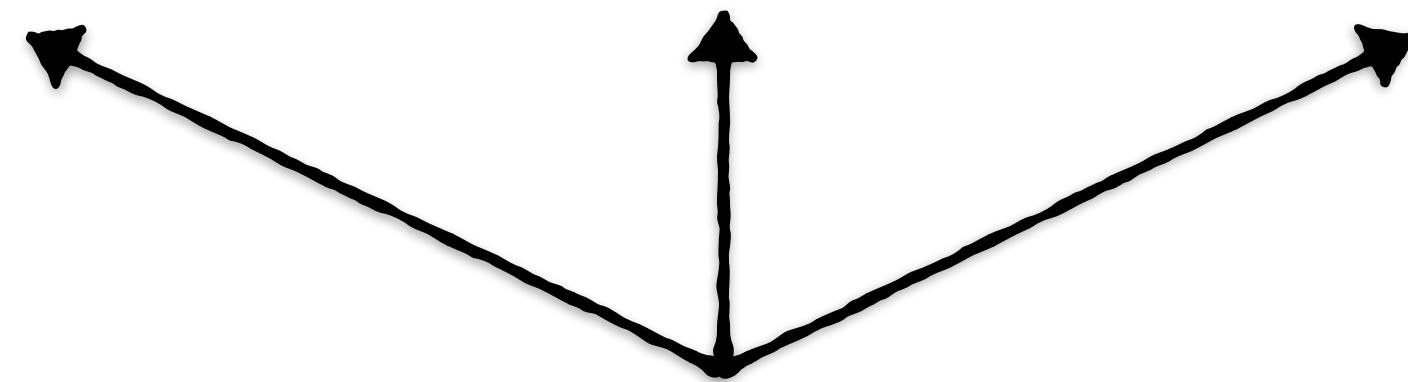
RAID 1

RAID 0+1

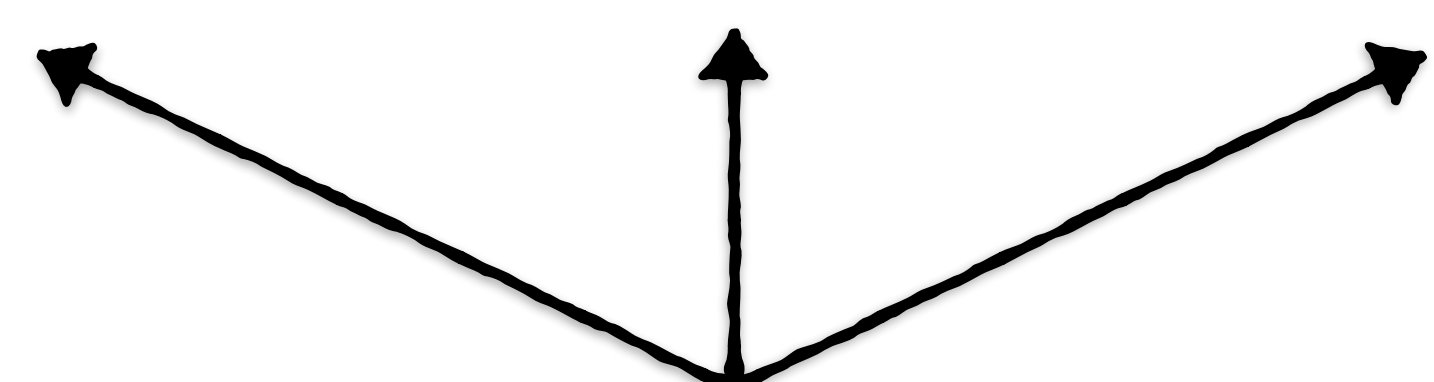
RAID 4

RAID 5

RAID 6



know these for midterm

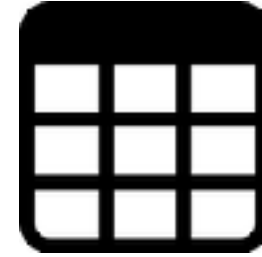


we'll cover these later

**Storage**



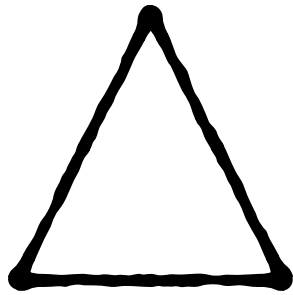
**Tables**



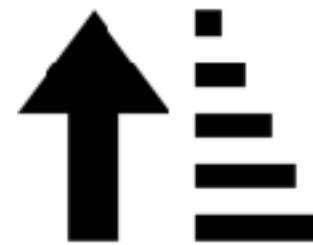
**Buffering**



**Indexes**



**Sorting**



**Operators**



**Query Optimization**



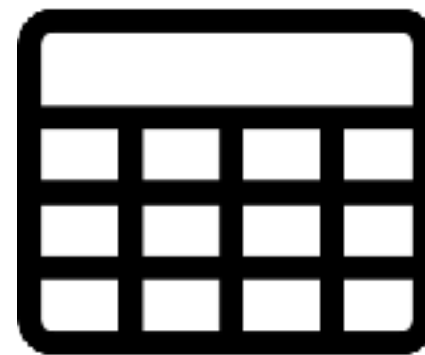
**Transactions**



**Recovery**



# Tables Management



**Database System Technology - Lecture 3, Chapter 9**

**Niv Dayan**

# Database Tables

A database consists of multiple tables

## Customers

ID	Name	email	Addr

## Orders

ID	Customer ID	Product ID	Date

# Database Tables

A database consists of multiple tables

How do we store them in storage efficiently?

## Customers

ID	Name	email	Addr

## Orders

ID	Customer ID	Product ID	Date





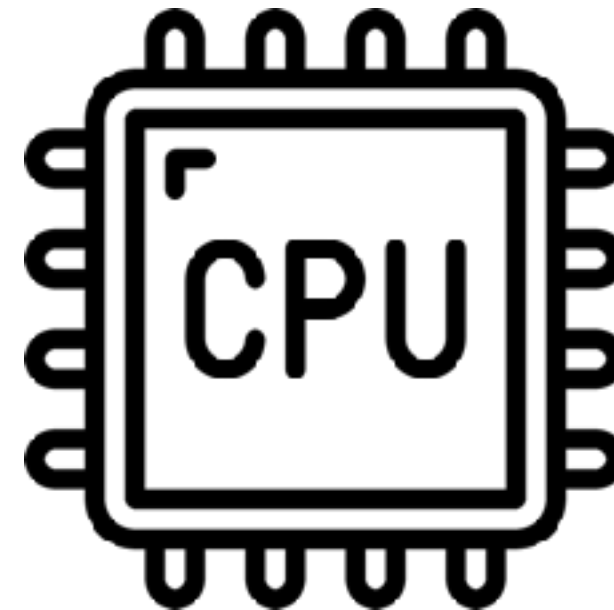
# Operations to Efficiently Support

1. Scans e.g., `select * from Customers`
2. Deletes e.g., `delete from Customers where name = "..."`
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4. Insertions e.g., `Insert into Customers ( , , , )`

Customers

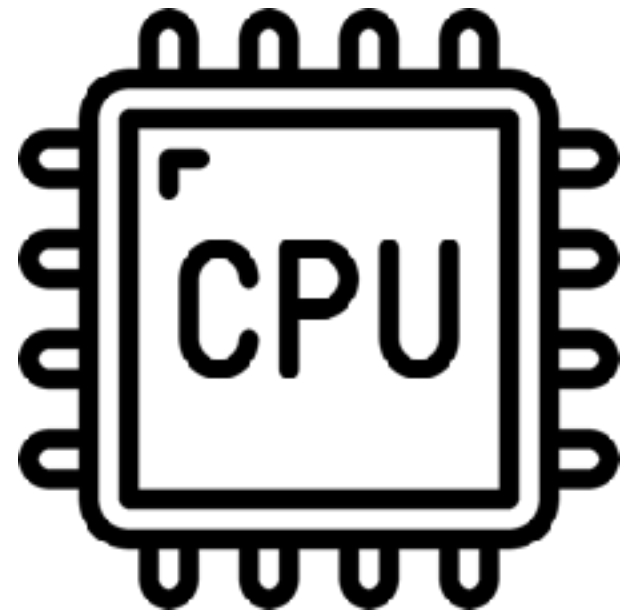
ID	Name	email	Addr

# Optimizing for Data Movement



In previous courses on algorithms & data structures, you learned to optimize CPU cycles for an algorithm.

# Optimizing for Data Movement



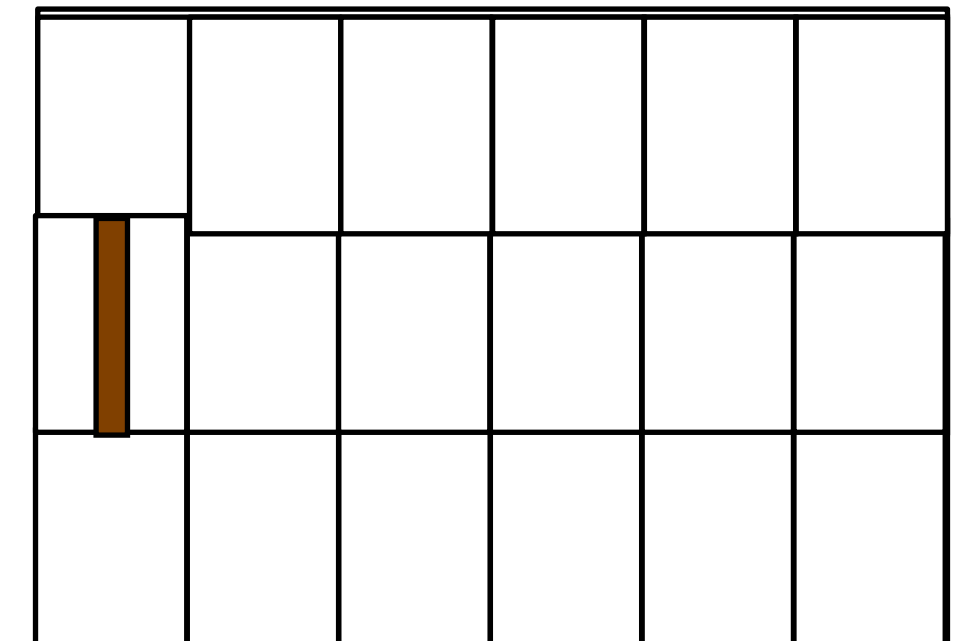
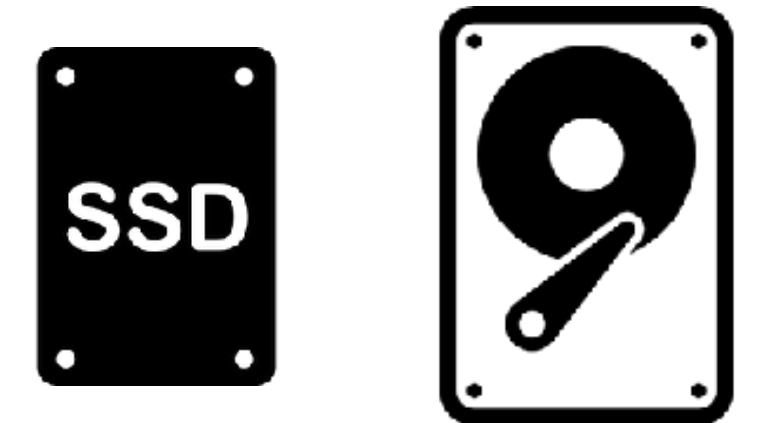
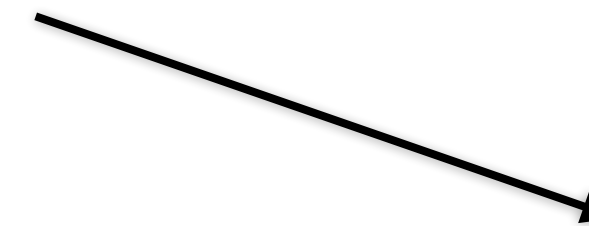
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As storage devices are far slower, in this course we focus on optimizing data movement.

# First Insight: Database Pages

Reading/writing from storage at units of less than  $\approx 4\text{KB}$  does not pay off.

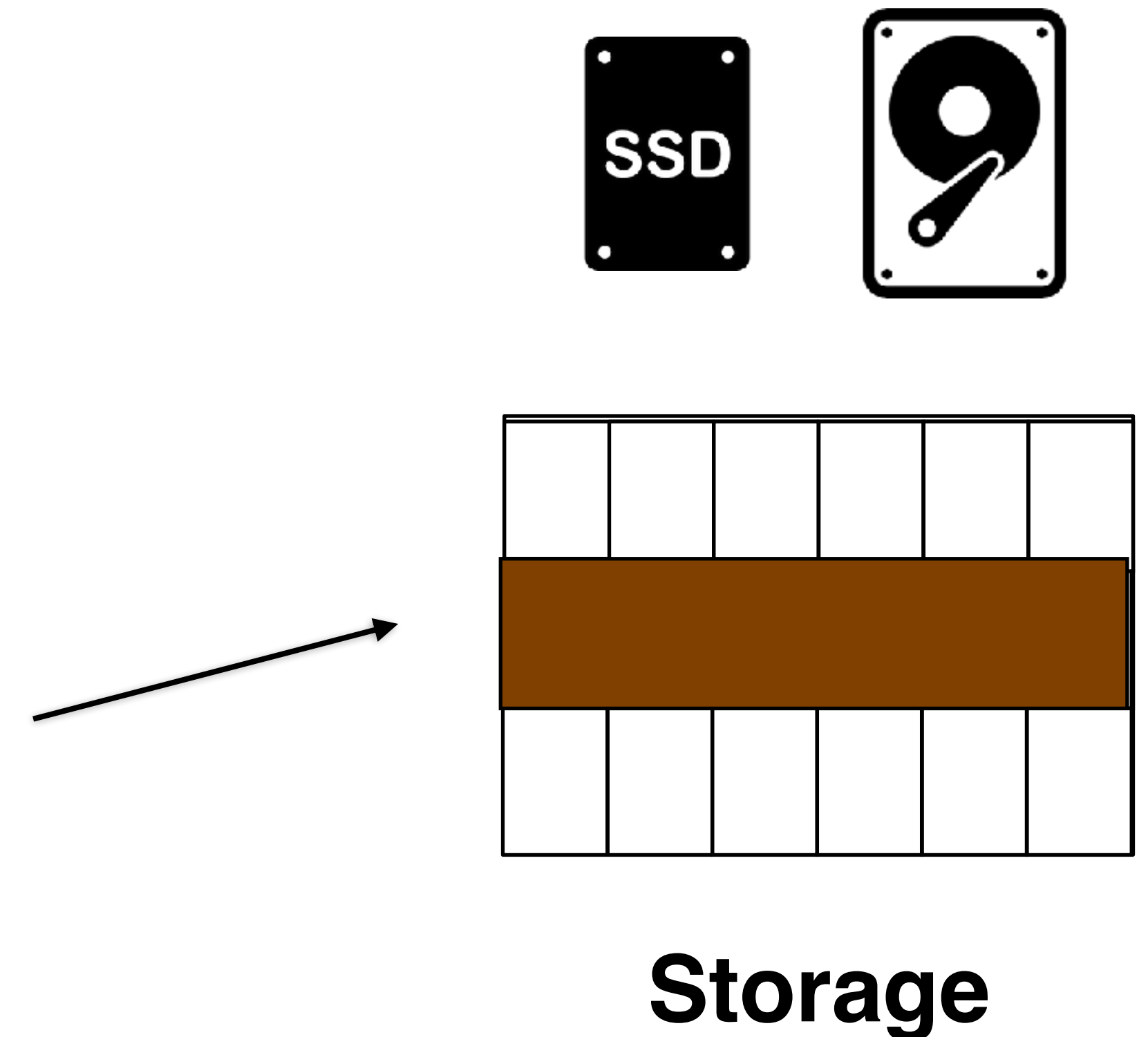


**Storage**

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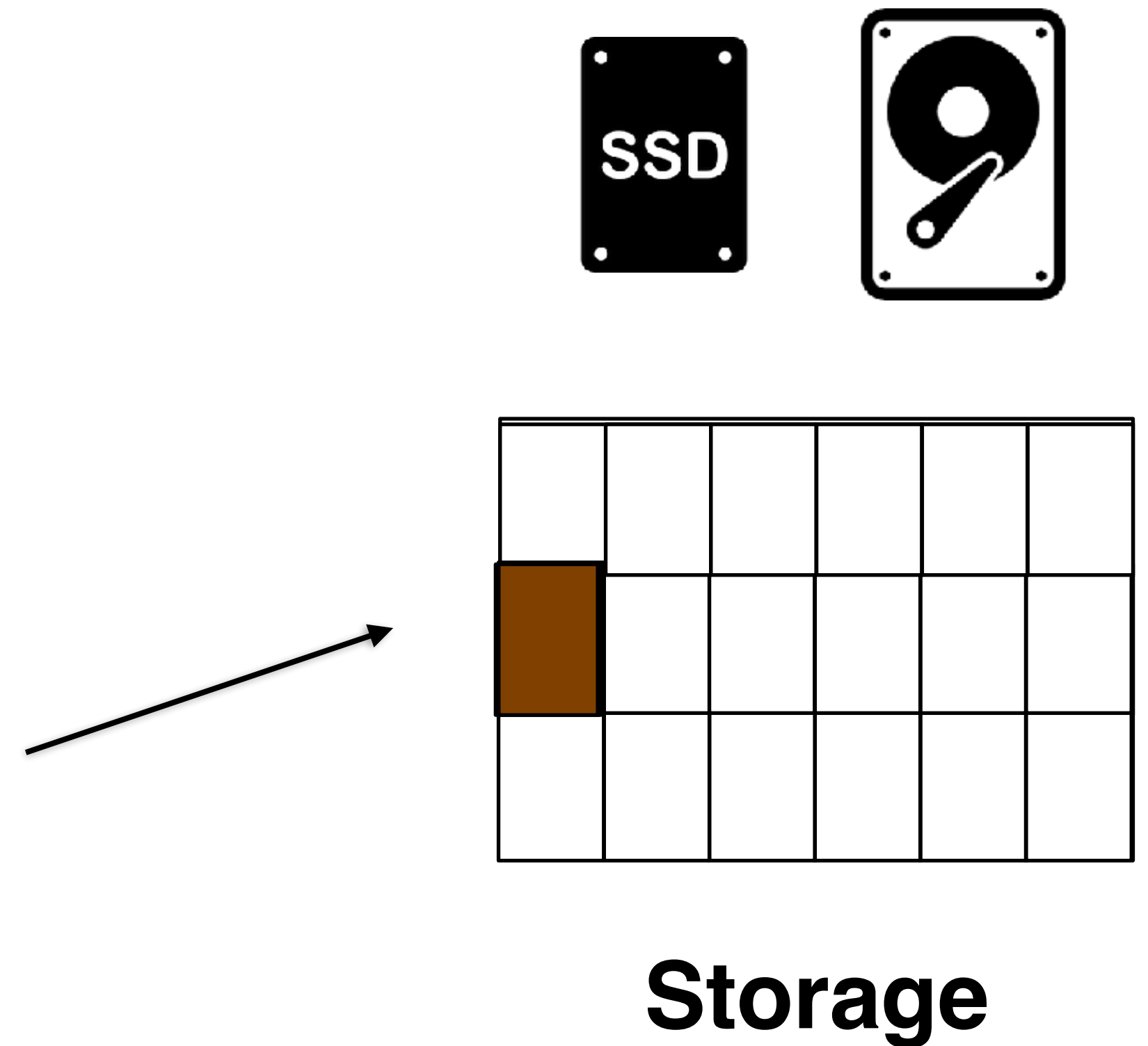
Reading/writing at very large units consumes memory and is less flexible for applications



# Database Pages

To balance, DBs use  $\approx 4\text{KB}$  as the read/write unit. This is known as a database page.

An I/O (input/output) is one read or write request of one database page.



# The Disk Access Model (The DAM Model)

We will shortly propose algorithms to support scans/delete/updates/inserts

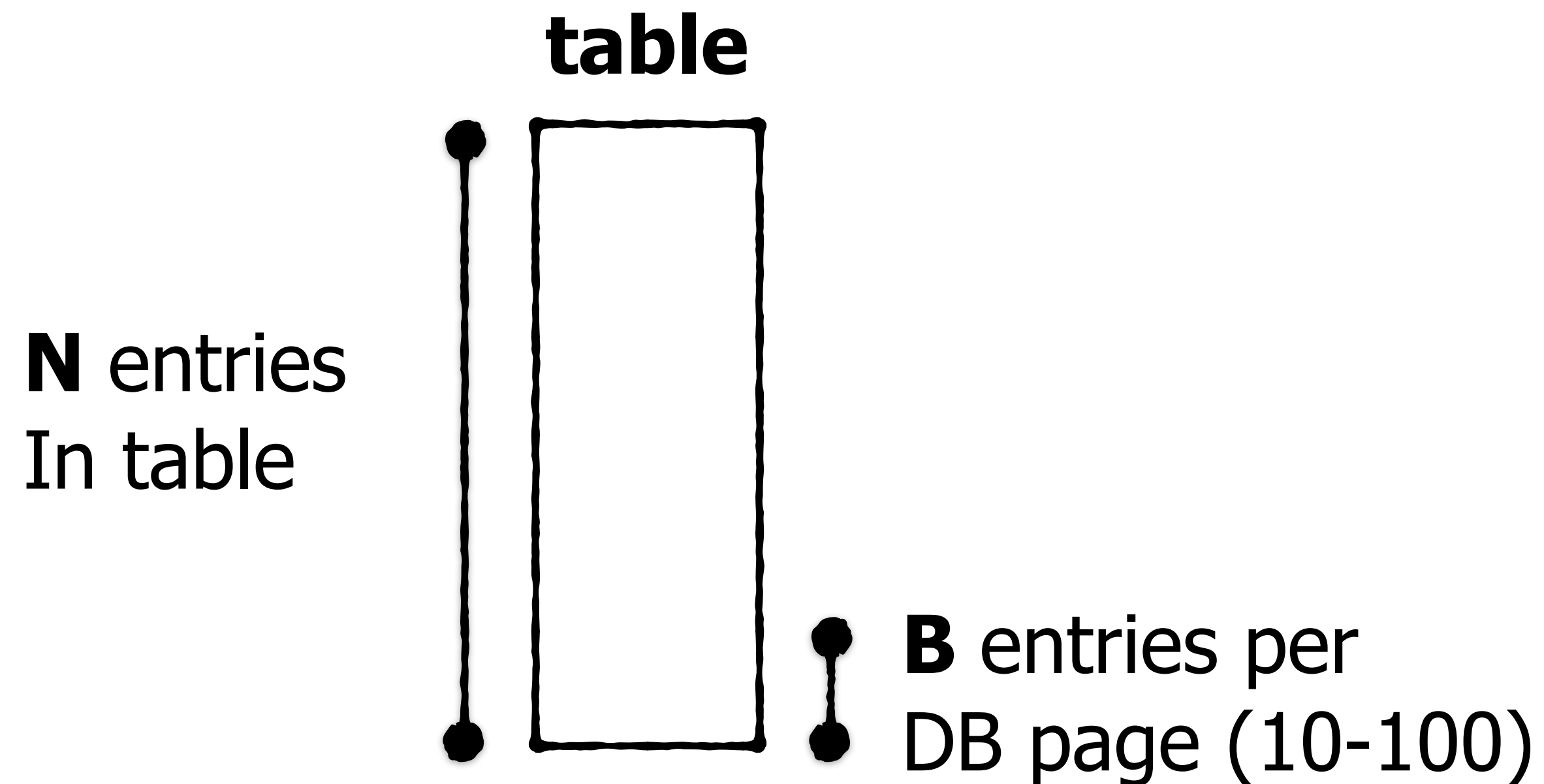
To reason about such algorithms, we need a cost model



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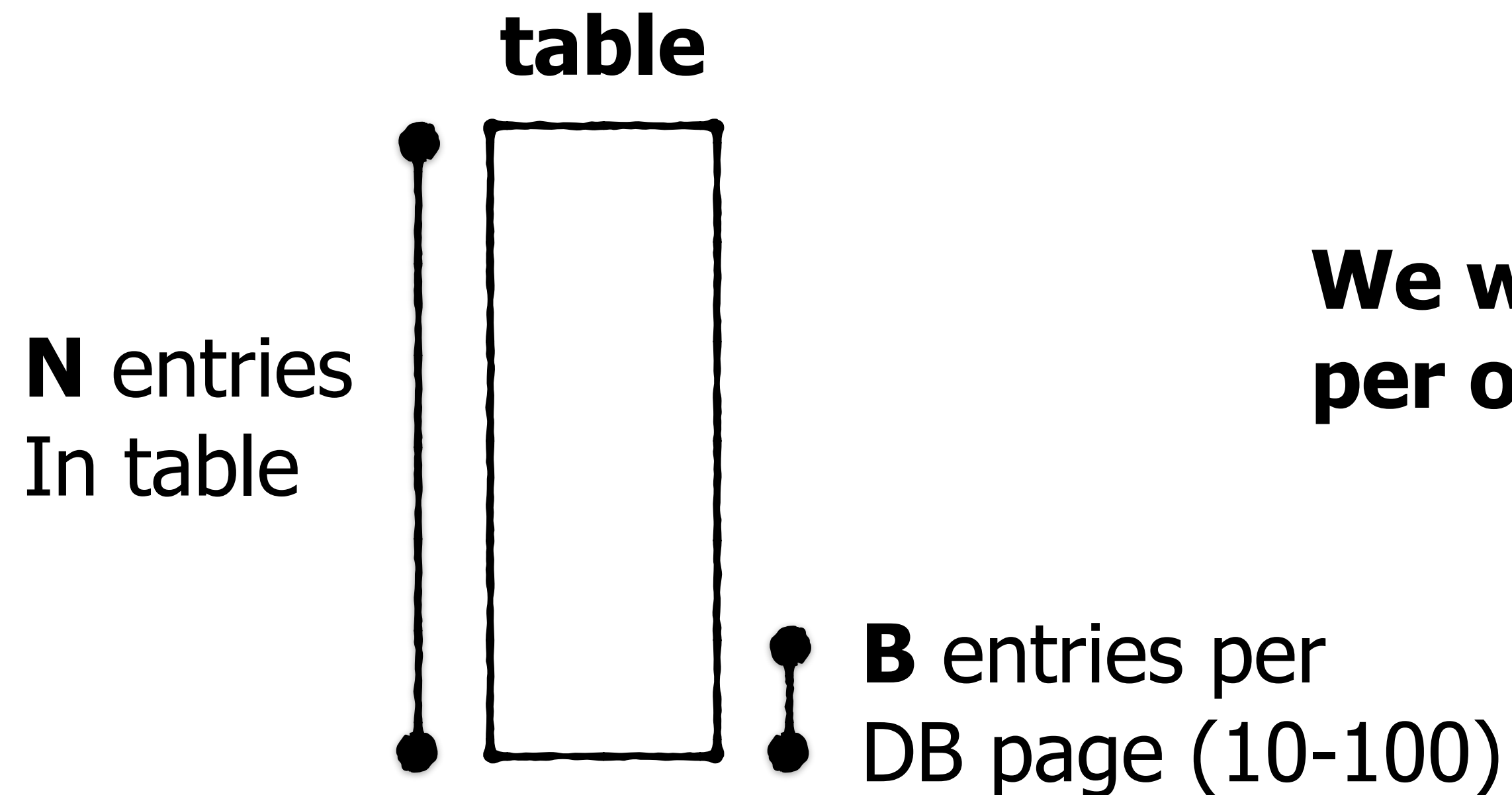




# The Disk Access Model (The DAM Model)

We will shortly propose algorithms to support scans/delete/updates/inserts

To reason about such algorithms, we need a cost model



**We will count the worst-case number of I/Os per operations with respect to N and B**

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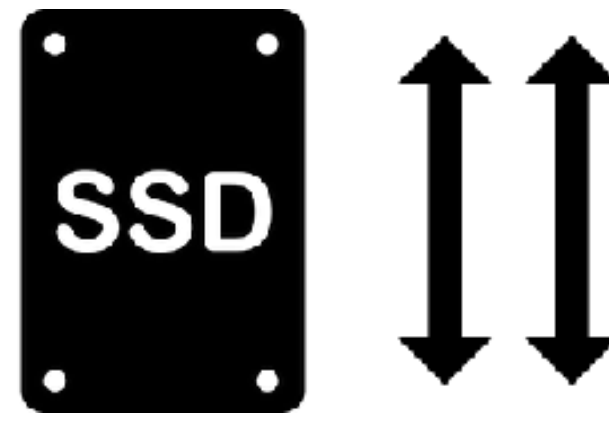
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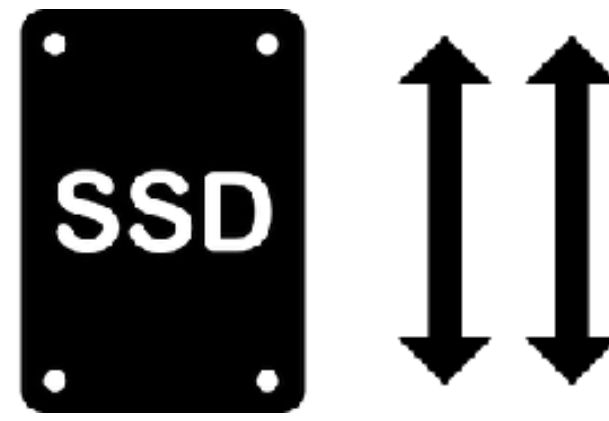
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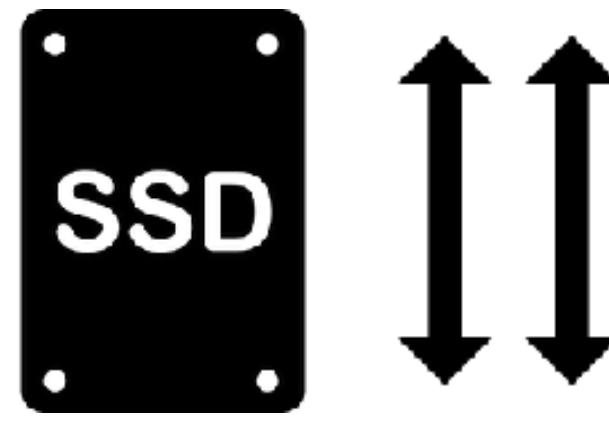
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Ignores SSD garbage-  
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**However, it's useful due to its simplicity.**

# Operations

1. Scans e.g., `select * from Customers`
2. Deletes e.g., `delete from Customers where name = "..."`
3. Updates e.g., `update Customers set email = "..."` where name = ""
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# Scans - How not to Support Them

# Customers

ID	Name	email	Addr

# Orders

ID	Customer ID	Product ID	Date

# Address Space

[illegible]



# Scans - How not to Support Them

Customers

ID	Name	email	Addr

Address Space


Orders

ID	Customer ID	Product ID	Date

*Mix table rows within  
the same pages*

**Scan cost?**

# Scans - How not to Support Them

Customers

ID	Name	email	Addr

Address Space


Orders

ID	Customer ID	Product ID	Date

Mix table rows within  
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Scan cost:  $O(N)$  I/Os

# Efficient Scans

Customers

ID	Name	email	Addr

Address Space


Orders

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**Separate tables rows into  
different sets of DB pages**

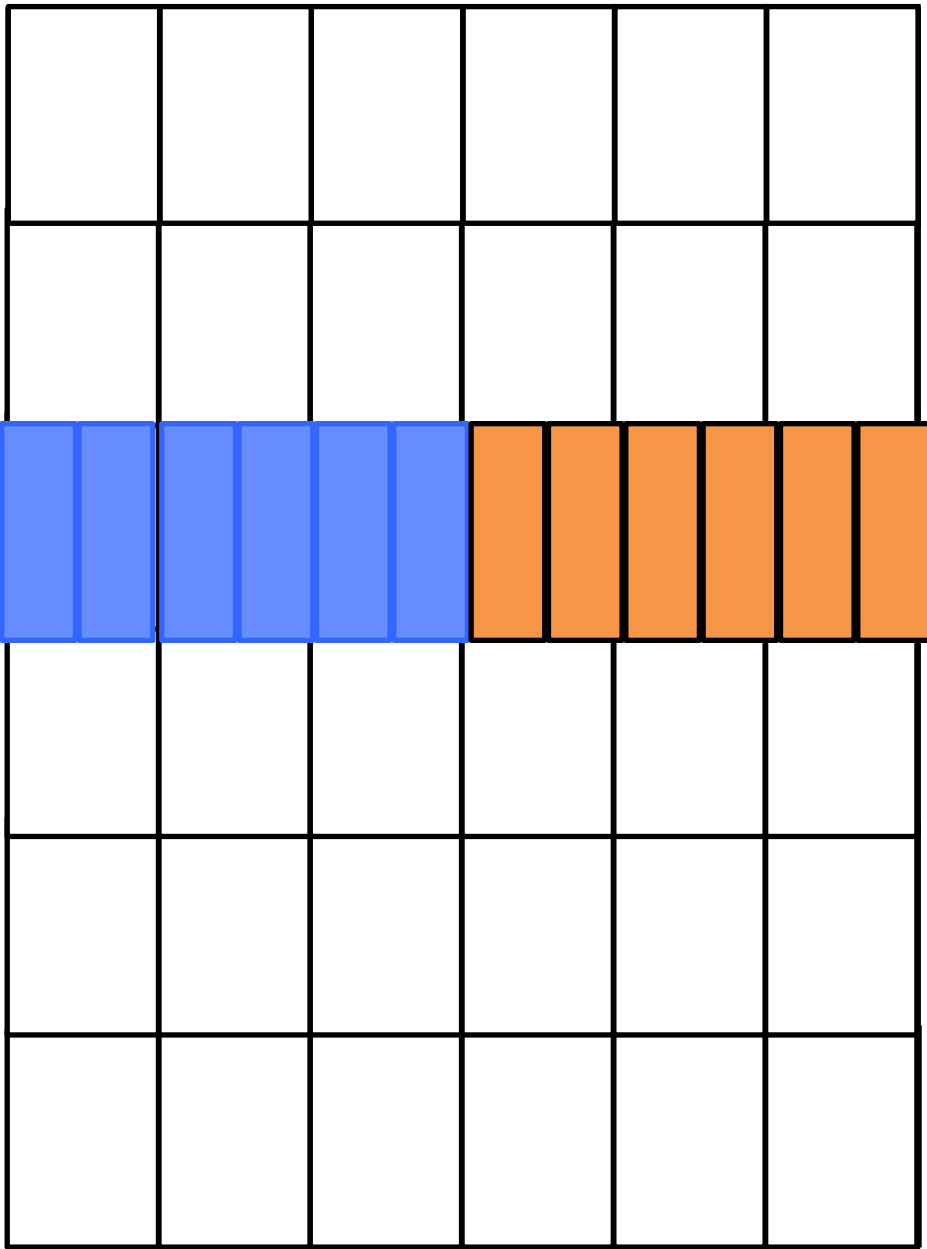
**Scan cost?**

# Efficient Scans

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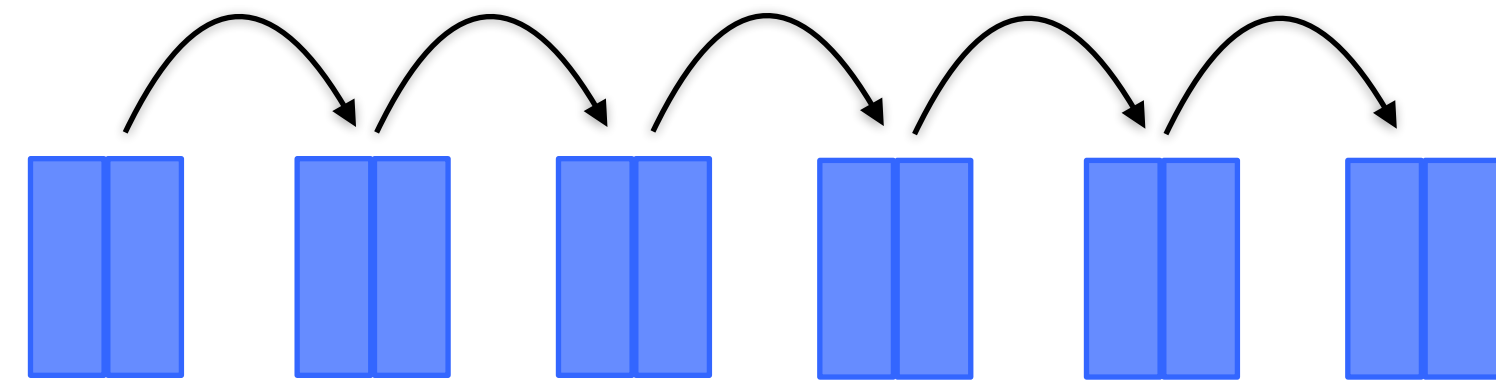
## Efficient Scans

# Which pages belong to which table?

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**Simplest Solution: Linked List**

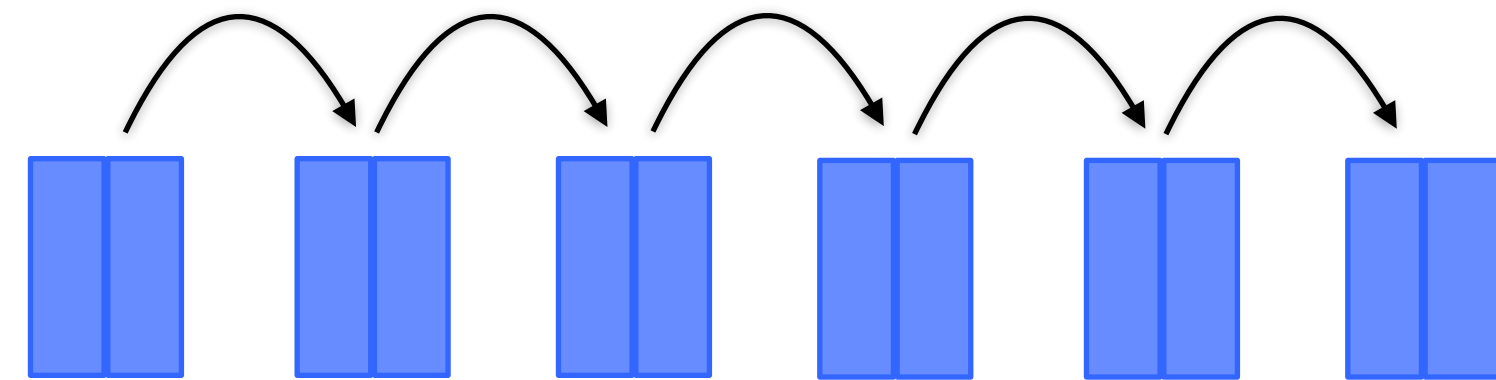


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**Problem:**



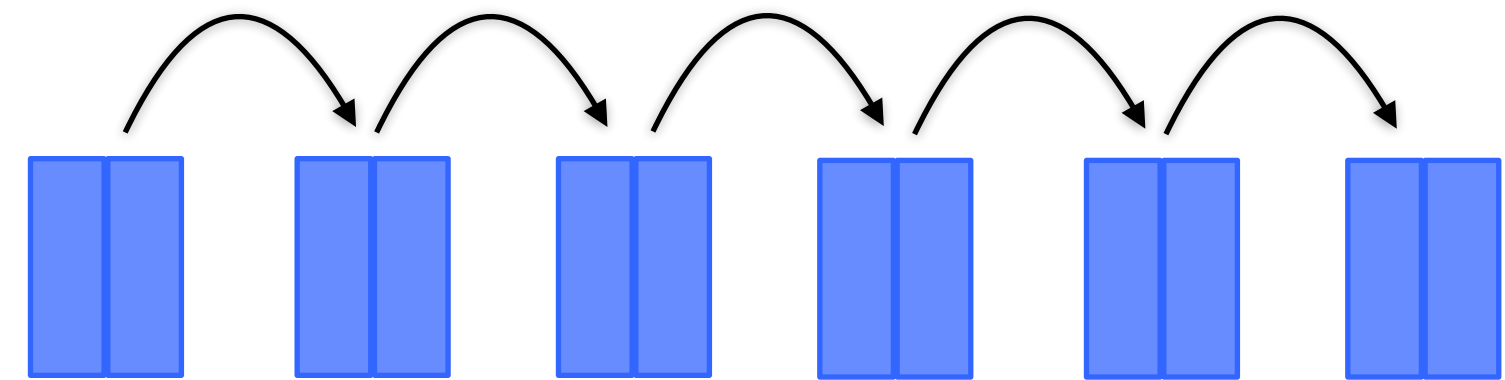
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Problem: **entails synchronous I/Os, which do not exploit SSD parallelism**

**Solution:**





# Efficient Scans

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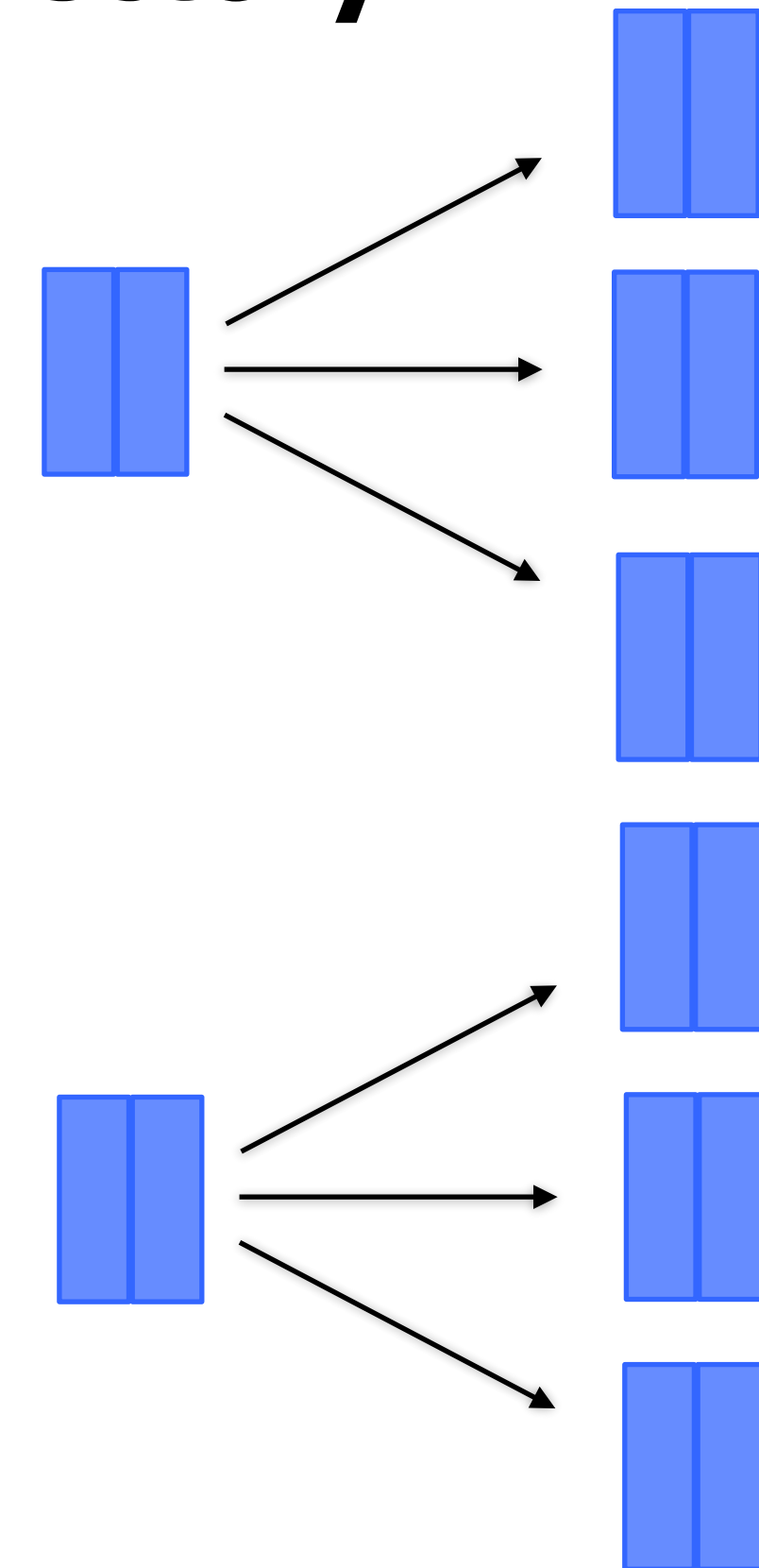
Simplest Solution: Linked List

Problem: entails synchronous I/Os,  
which do not exploit SSD parallelism

Solution: **Employ directory to allow  
reading many pages asynchronously**



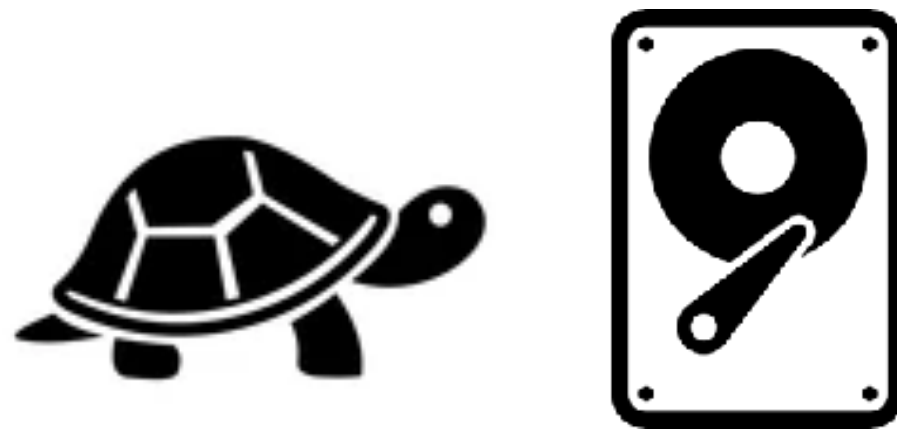
## Directory



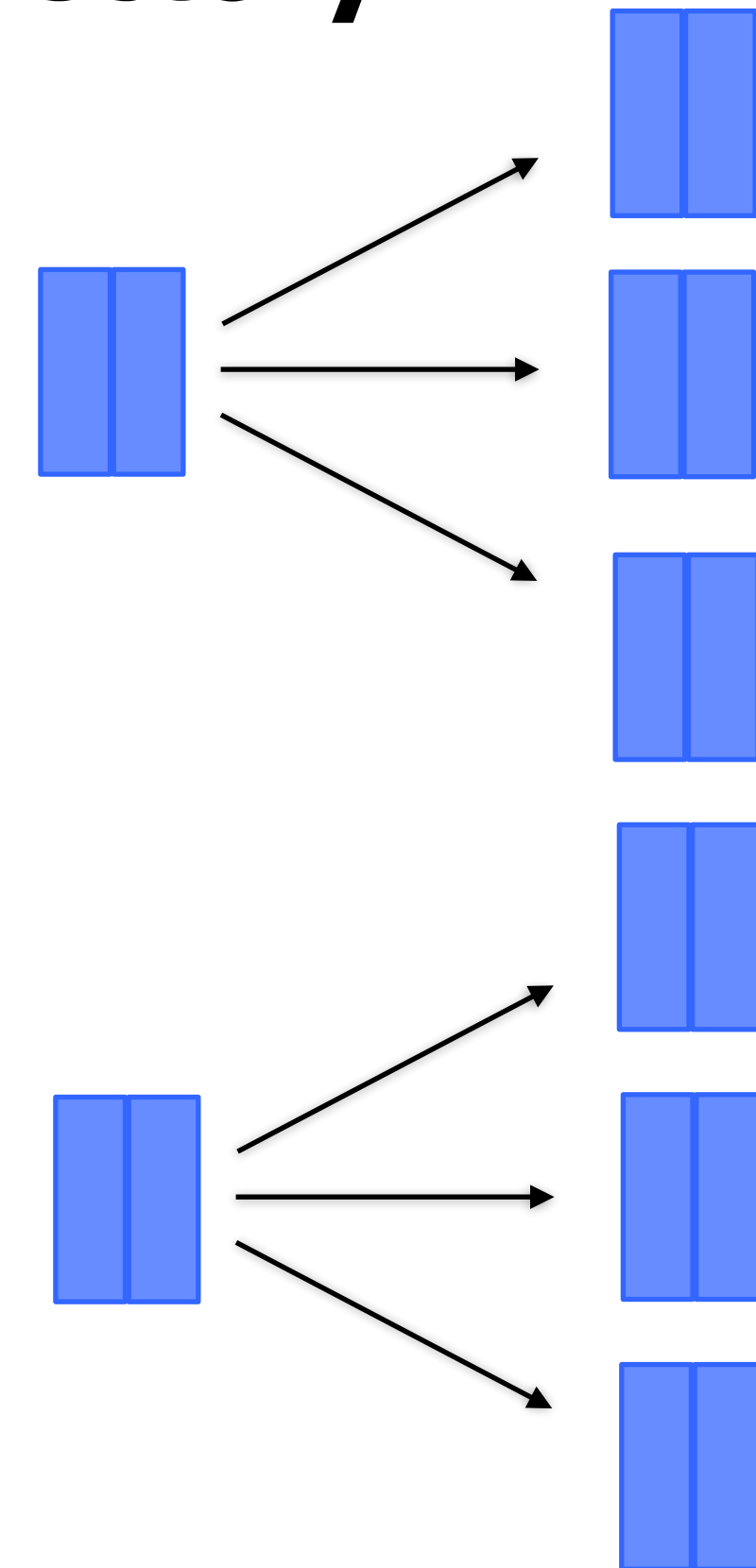
# Efficient Scans

Which pages belong to which table?

**Problem: small I/Os, which do not saturate a disk's sequential bandwidth**



**Directory**



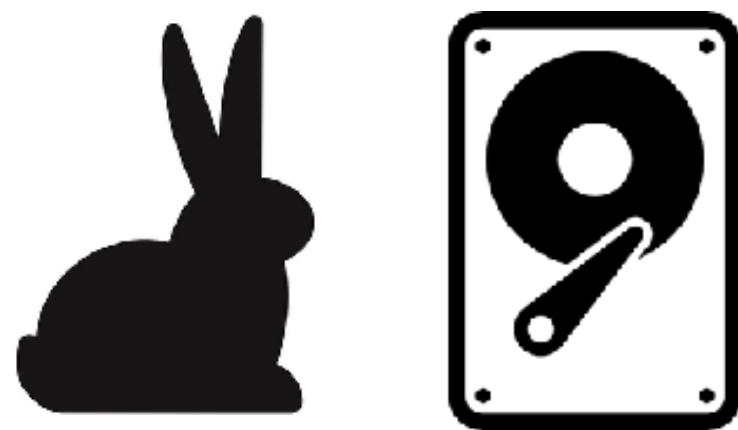
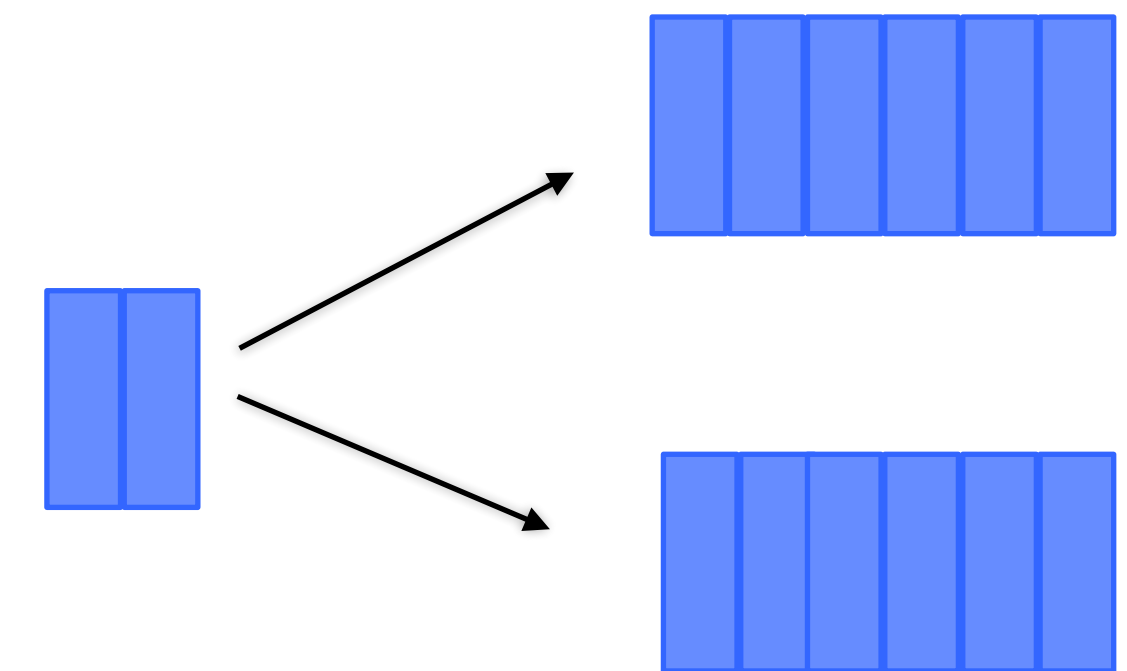
# Efficient Scans

Which pages belong to which table?

Problem: small I/Os, which do not saturate a disk's sequential bandwidth

Solution: **Store multiple database pages contiguously along "extents"** (8-64 pages)

## Directory



# Efficient Scans

## Directory

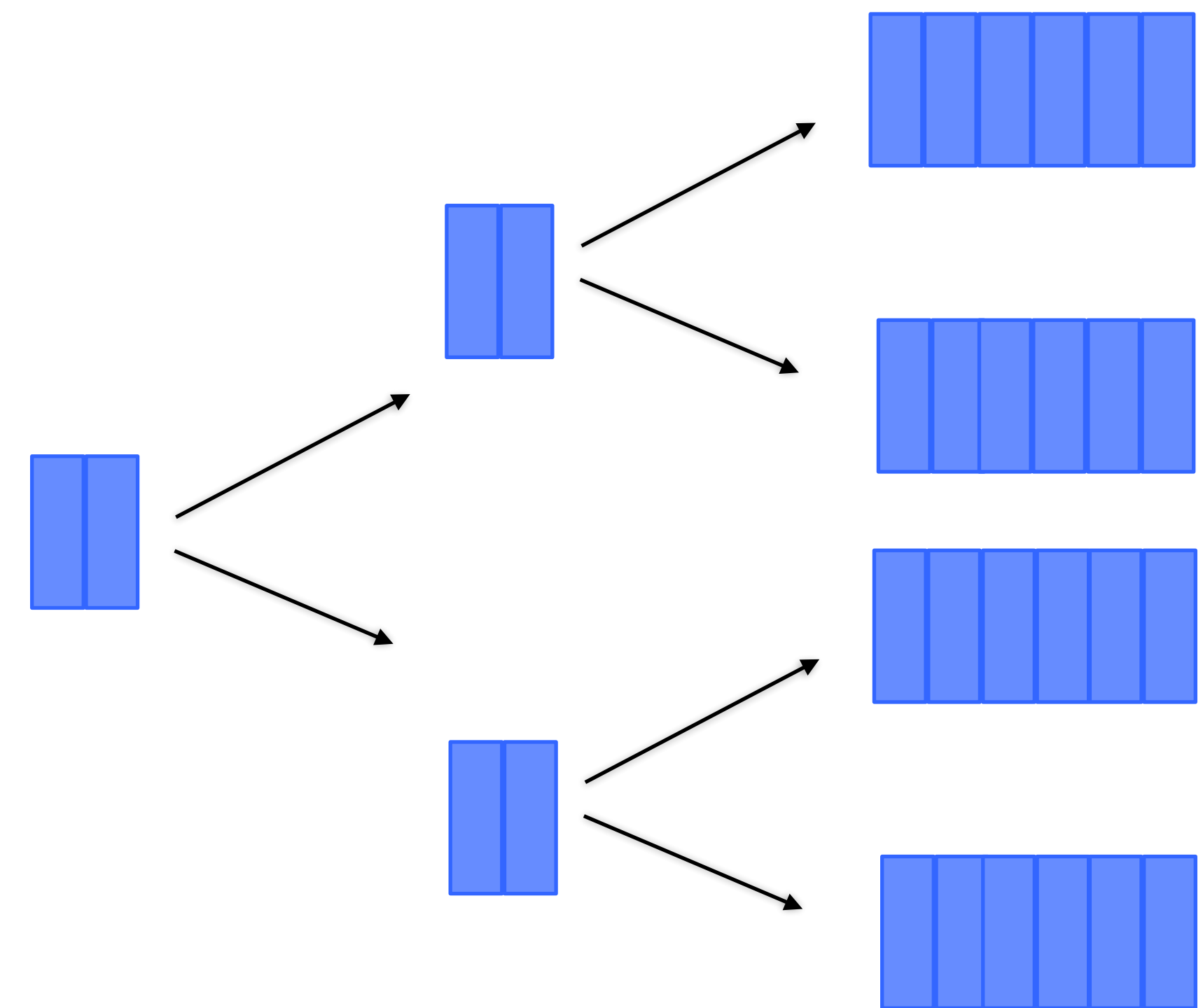
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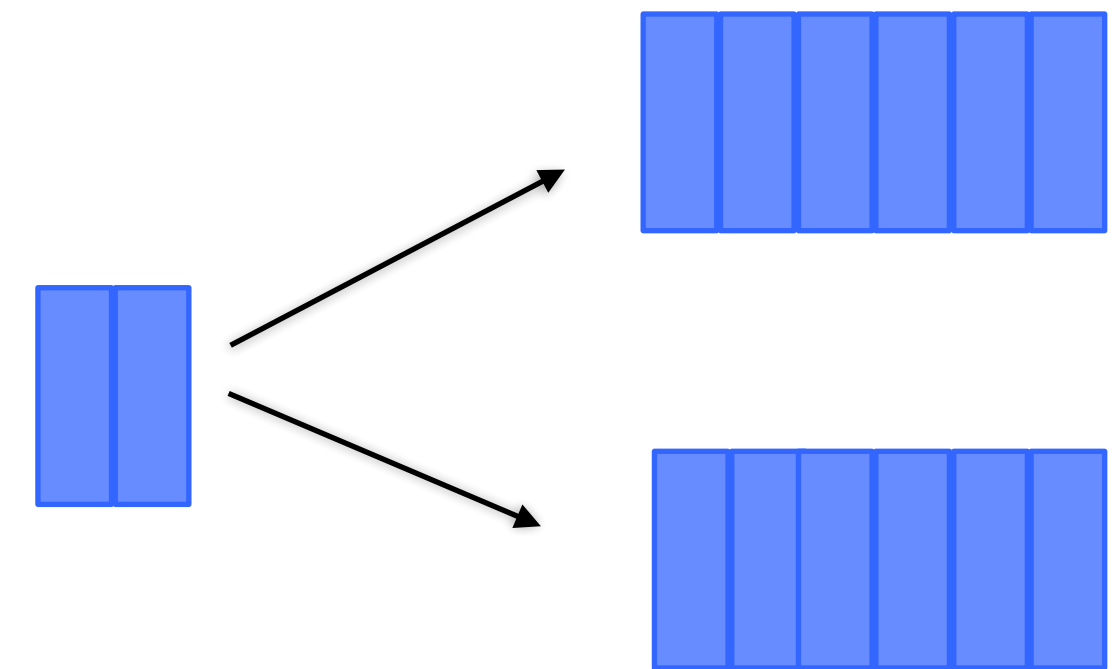
Bonus: Saves some metadata

**File can grow as a tree if it gets large**



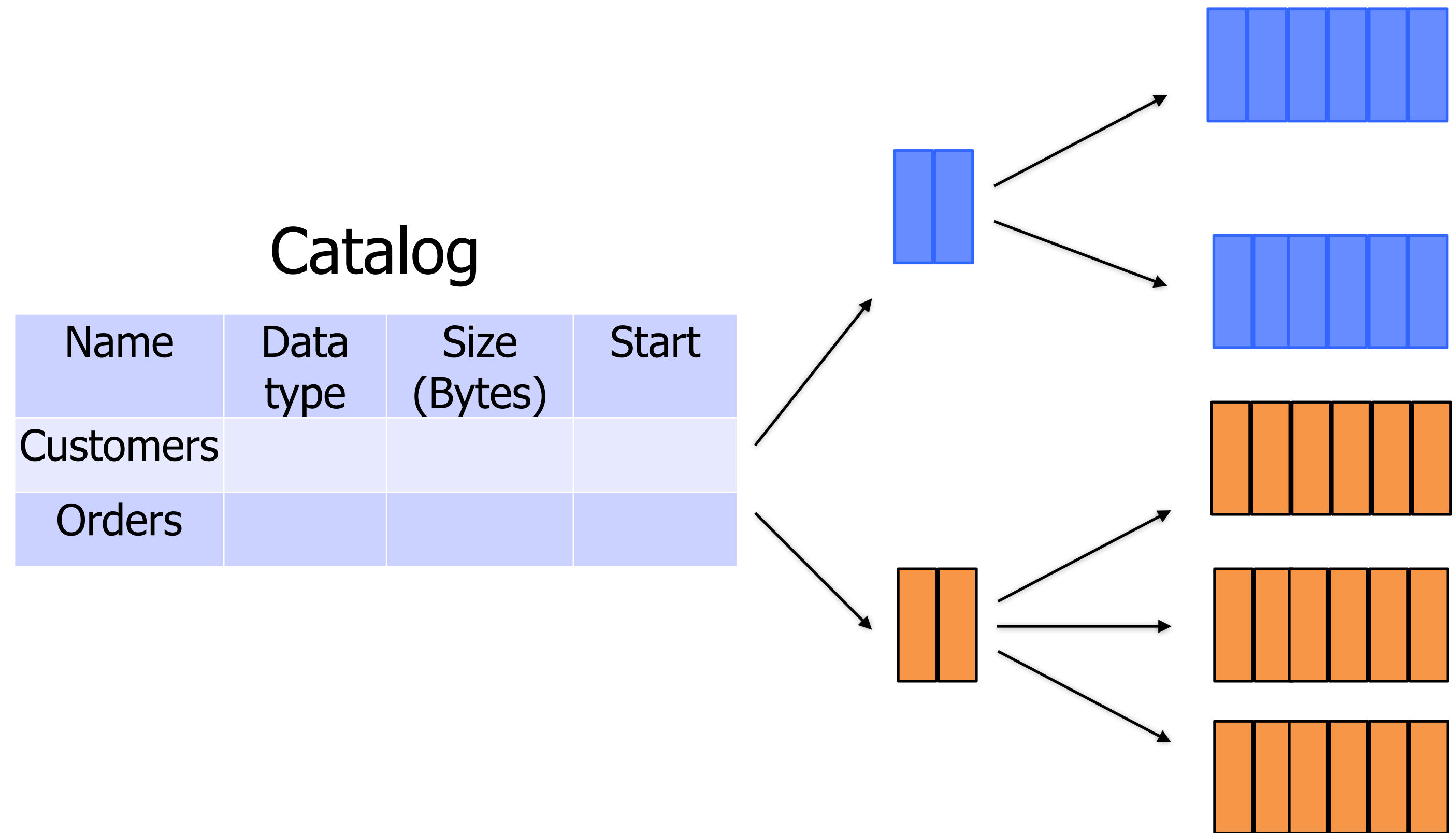
# Efficient Scans

**How to keep track of directories of all files?**



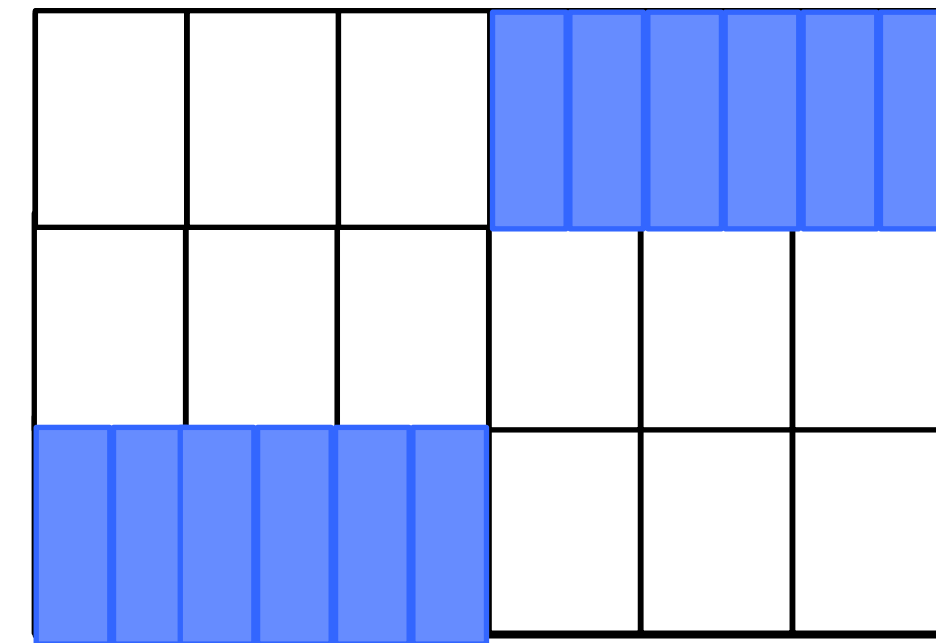
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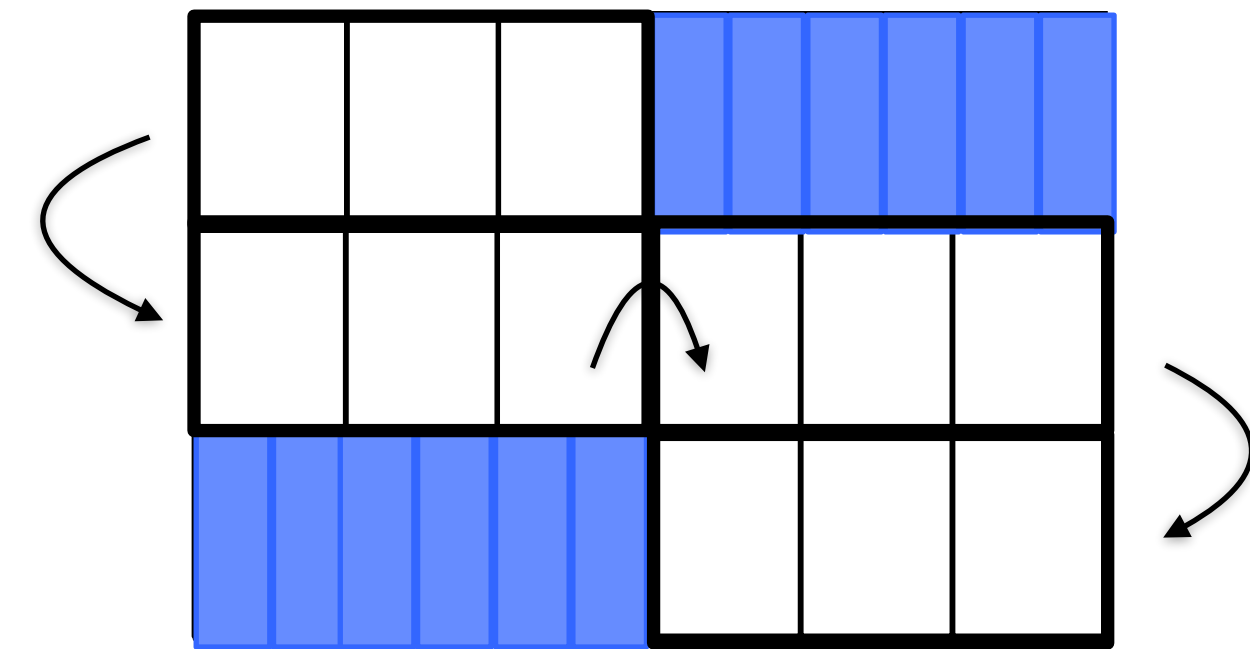
## How to keep track of free pages/extents?



# Efficient Scans

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**Solution 1: linked list (slower)**





# Efficient Scans

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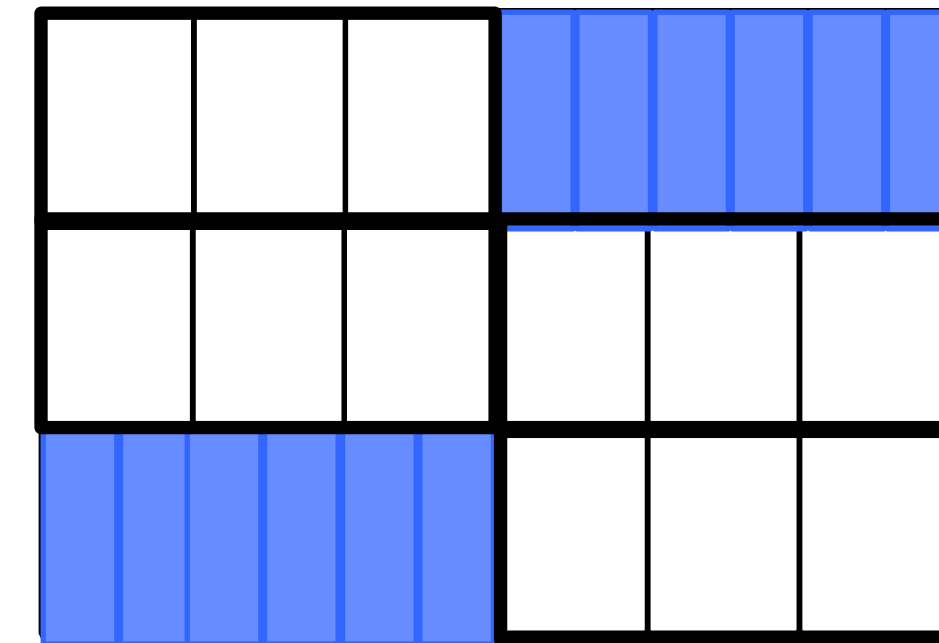
## Solution 1: linked list (slower)

## Solution 2: bitmap (takes space)

# 01

00

**10**



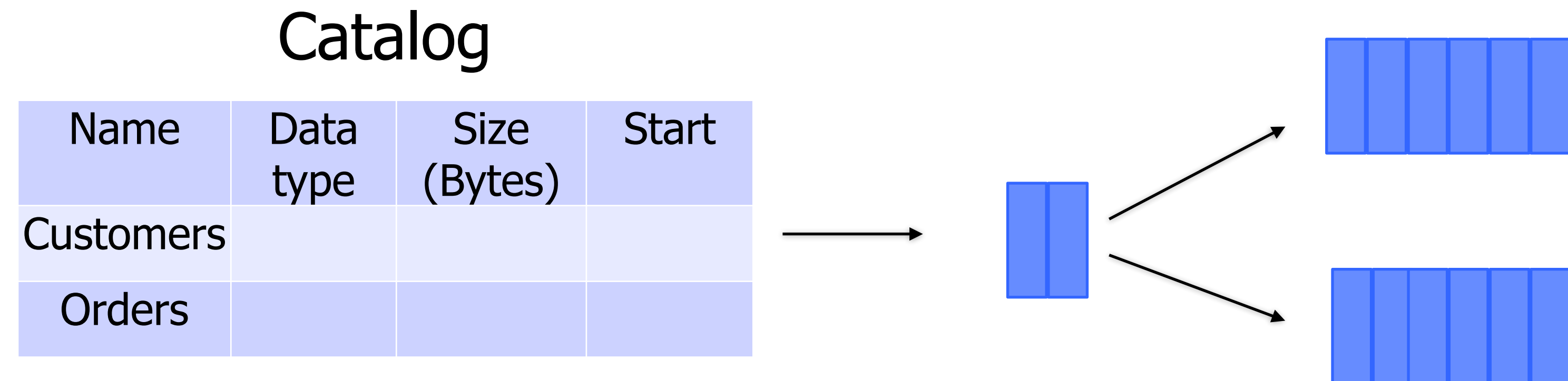
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# Supporting Deletes

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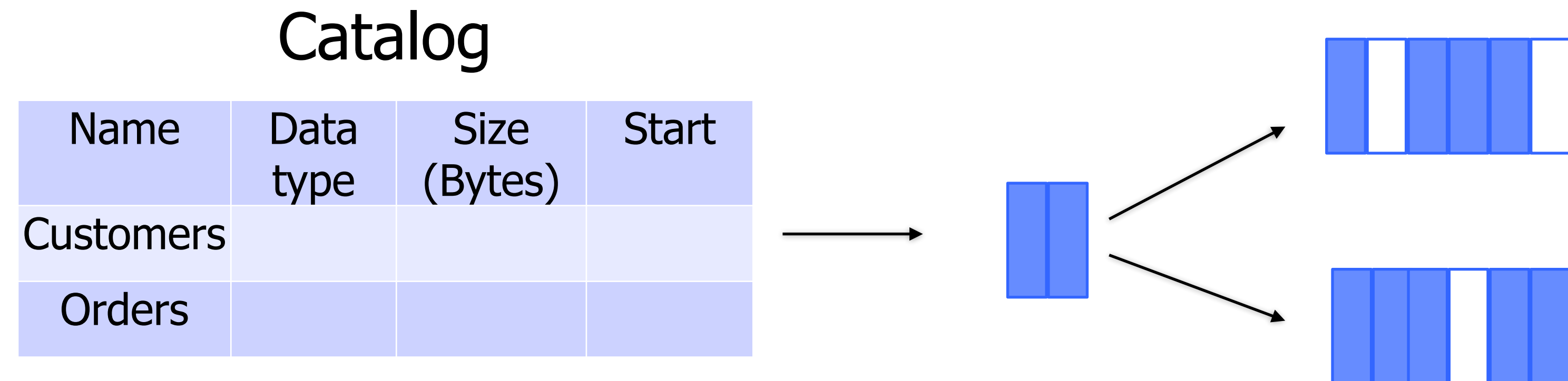
**Simplest solution?**



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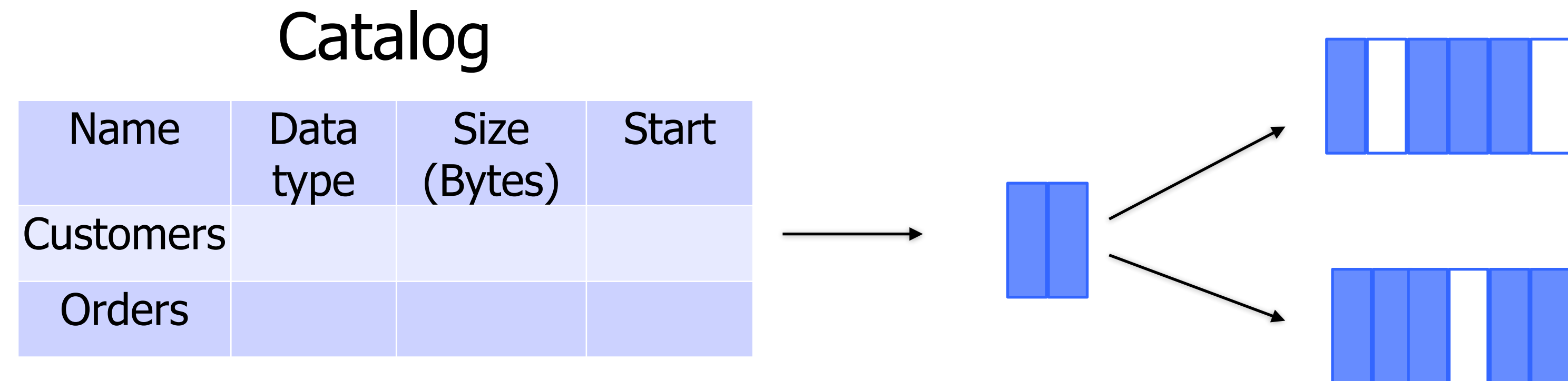
Simplest solution? **Scan of the table. Creates "holes".**



# Supporting Deletes

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Simplest solution? Scan of the table. Creates "holes".



**Cost:  $O(1)$  write and  $O(N/B)$  reads.**

# Operations

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2. Deletes

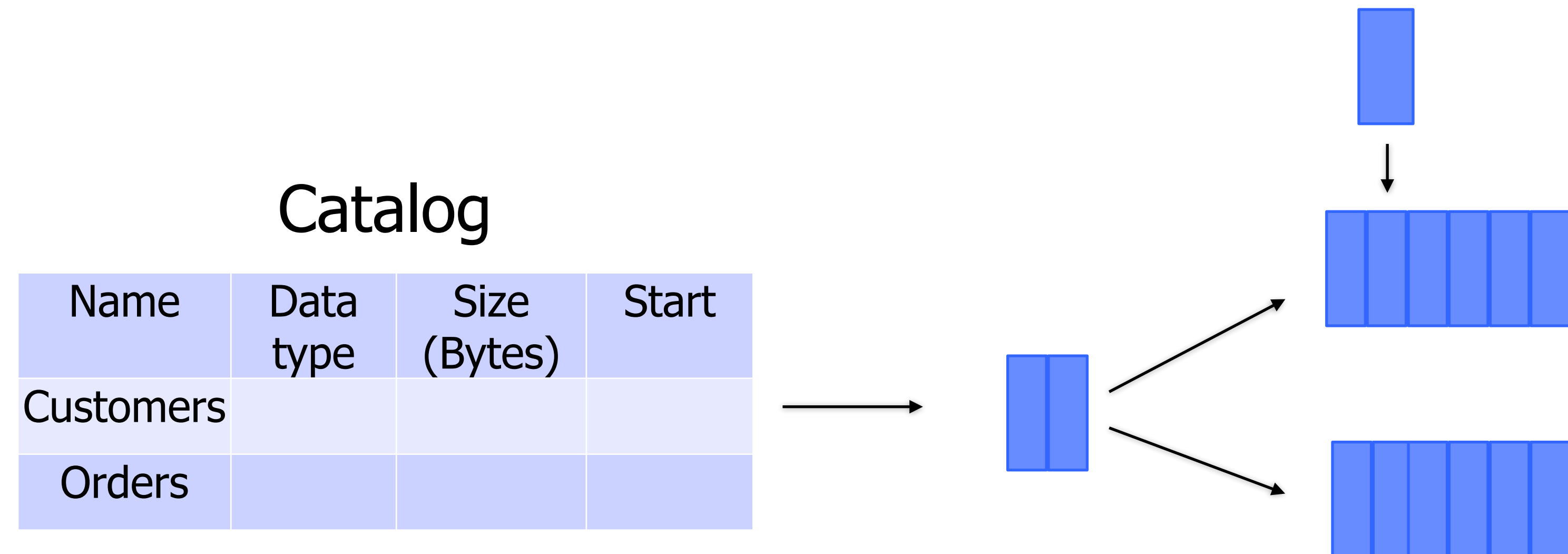
**3. Updates**

4. Insertions

# Supporting Updates

e.g., update Customers set email = "...\" where name = \"\""

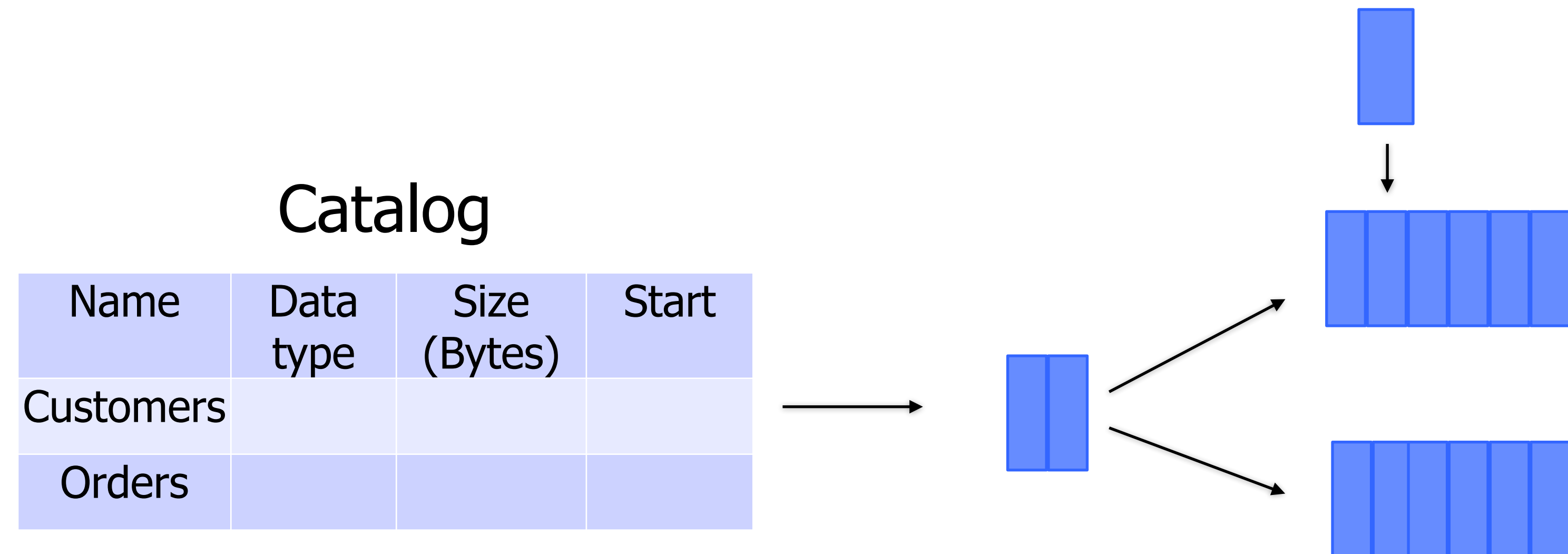
**Scan and update.**



# Supporting Updates

e.g., update Customers set email = "...\" where name = \"\""

**Scan and update. If newer version is too large, delete & reinsert**

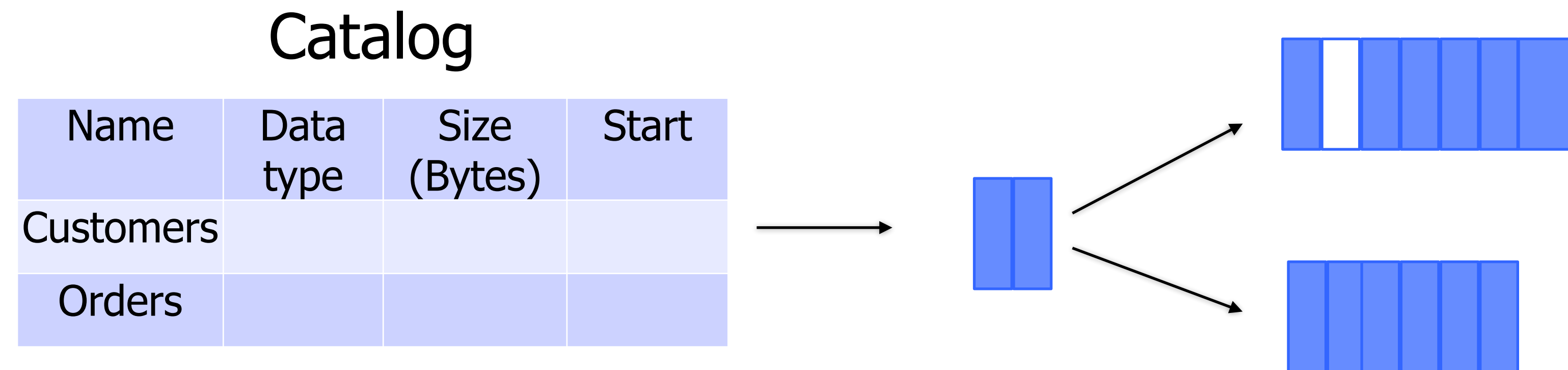




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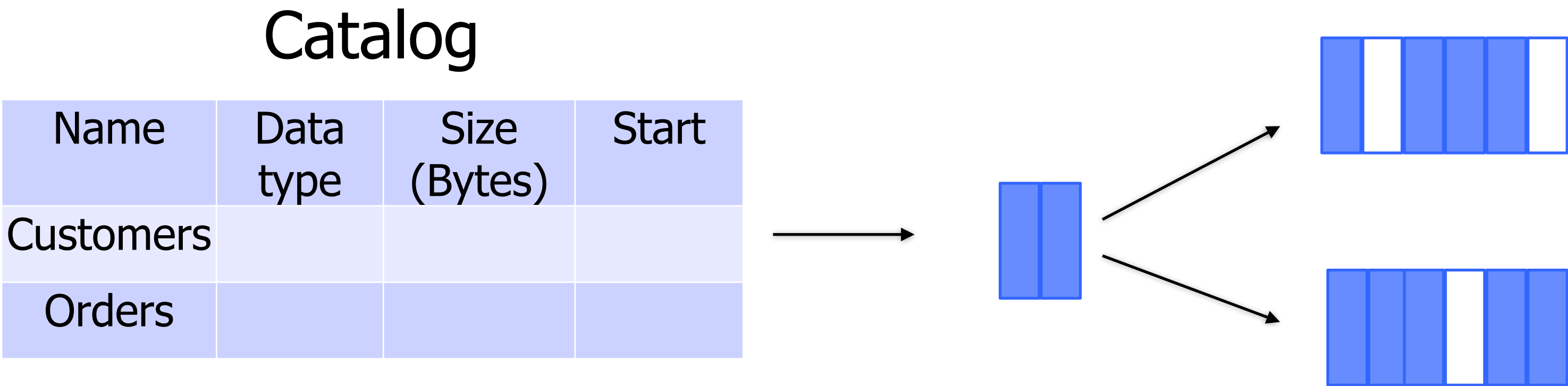
# Operations

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- 4. Insertions**

# Supporting Insertions

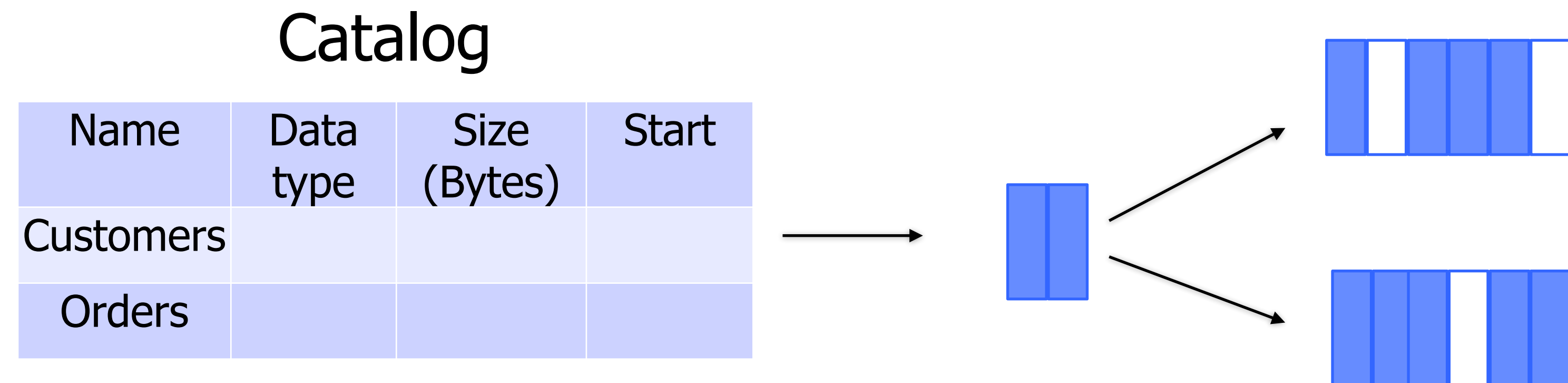
e.g., Insert into Customers ( , , , )

**Solutions?**



# Supporting Insertions

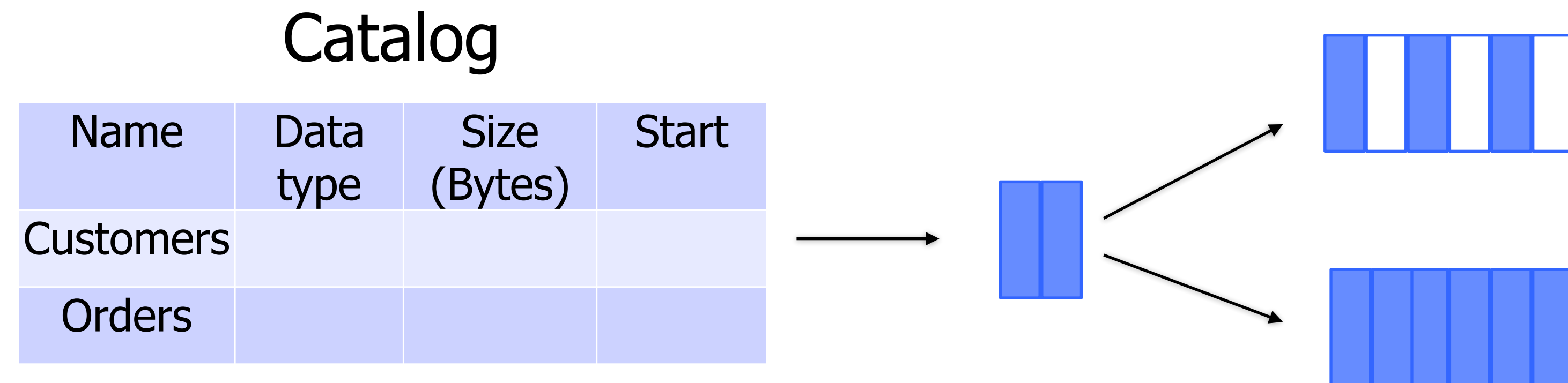
**(1) Scan & find space. Cost:  $O(N/B)$  reads and  $O(1)$  write.**



# Supporting Insertions

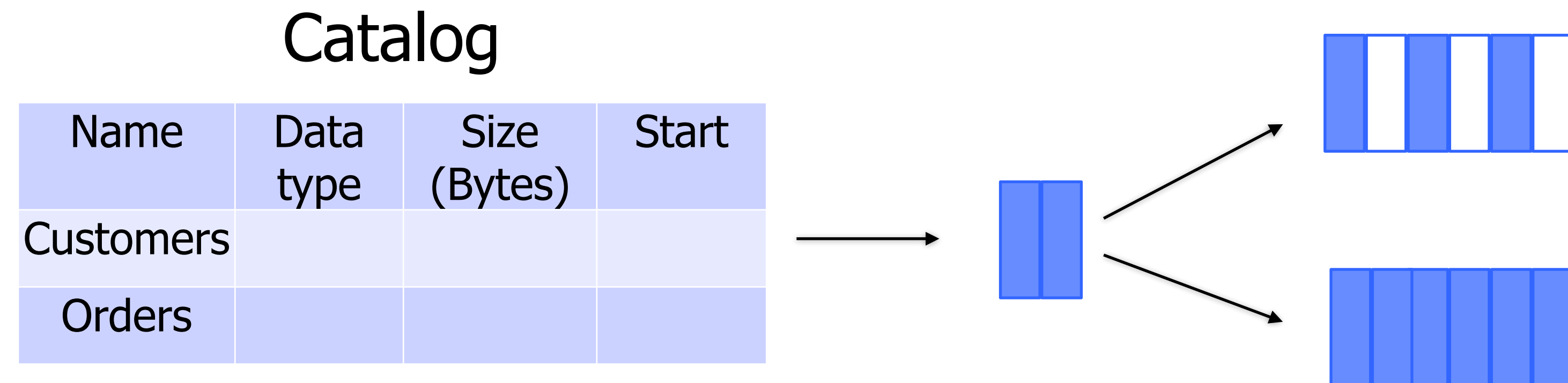
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**(2) Separate Linked list of pages with free space.**



# Supporting Insertions

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- (2) Separate Linked list of pages with free space.**  
**Cost:  $O(1)$  reads &  $O(1)$  write for fixed-sized entries**



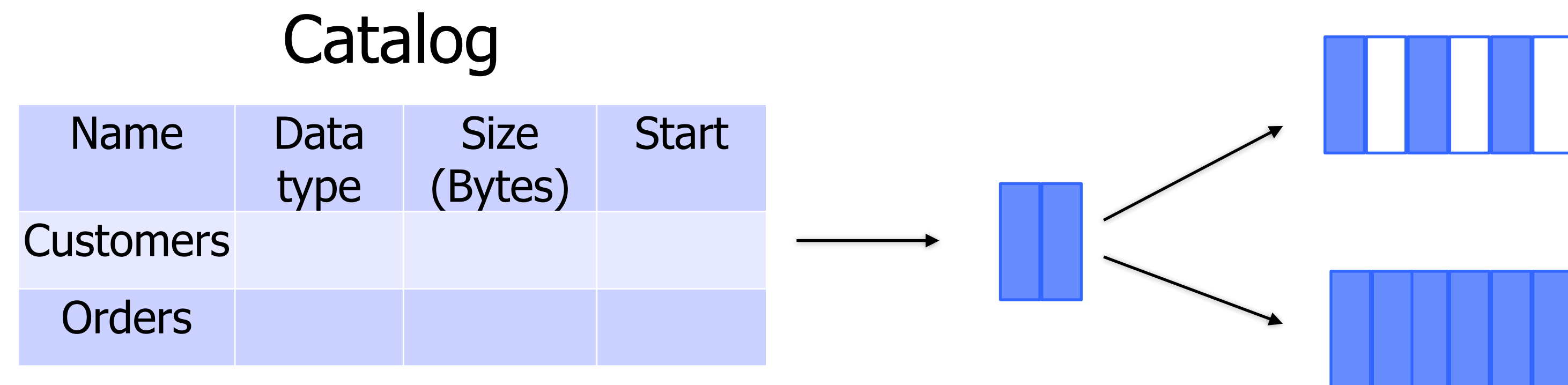
# Supporting Insertions

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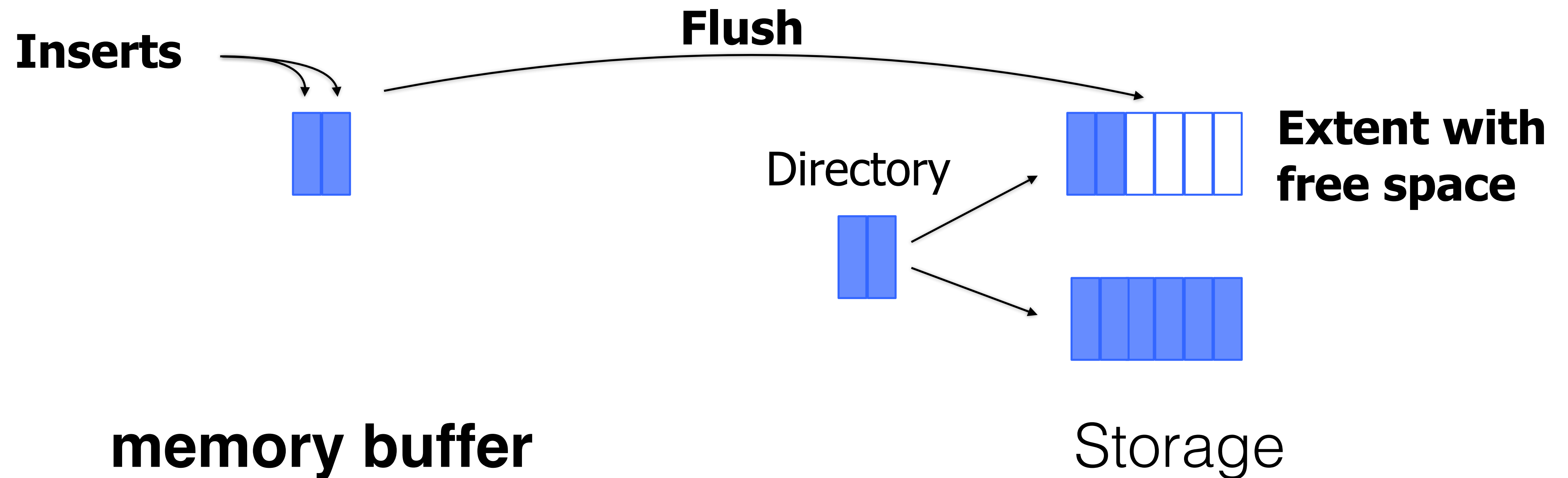
**Cost:  $O(1)$  reads &  $O(1)$  write for fixed-sized entries**

**Cost:  $O(N/B)$  reads &  $O(1)$  write for variable-sized entries**



# Supporting Insertions

**(3) buffer insertions in memory until a page fills up & append to extent**

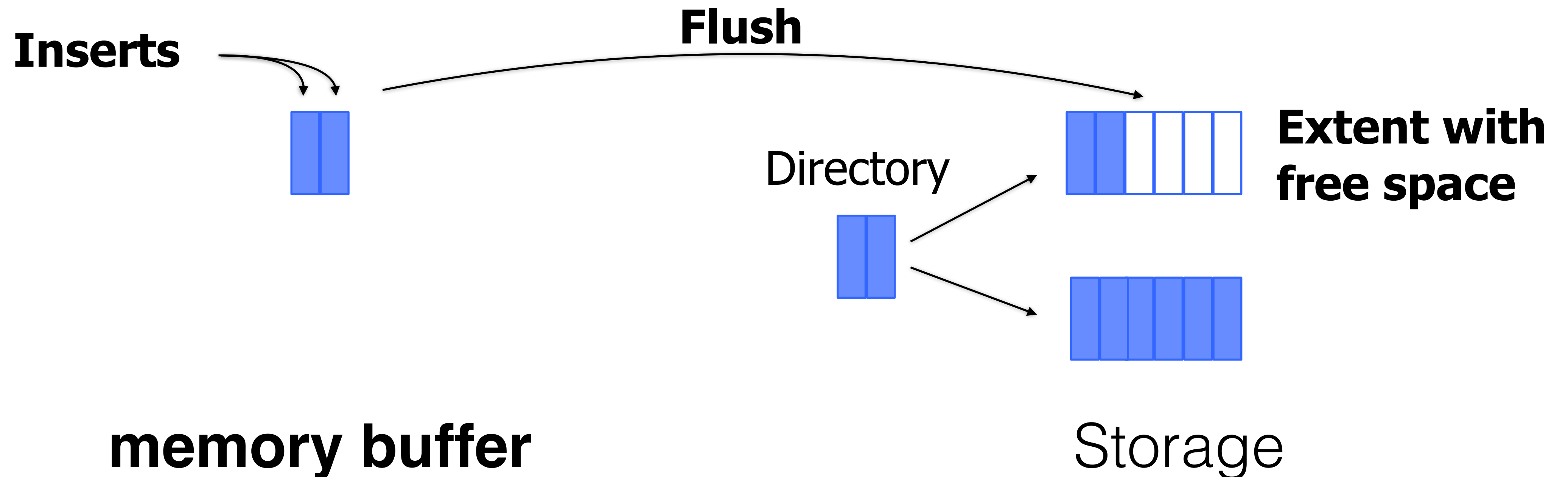




# Supporting Insertions

(3) buffer insertions in memory until a page fills up & append to extent

**Cost: No reads and  $O(1/B)$  of a write**



# Supporting Insertions

- (1) Scan & find space. Cost:  $O(N/B)$  reads and  $O(1)$  write.
- (2) Separate Linked list of pages with free space.
  - Cost:  $O(1)$  reads &  $O(1)$  write for fixed-sized entries
  - Cost:  $O(N/B)$  reads &  $O(1)$  write for variable-sized entries
- (3) buffer insertions in memory until a page fills up & append to extent  
**Cost: No reads and  $O(1/B)$  of a write**

# Internal Page Organization

Recall each page is 4-8 KB

Suppose rows are fixed-sized

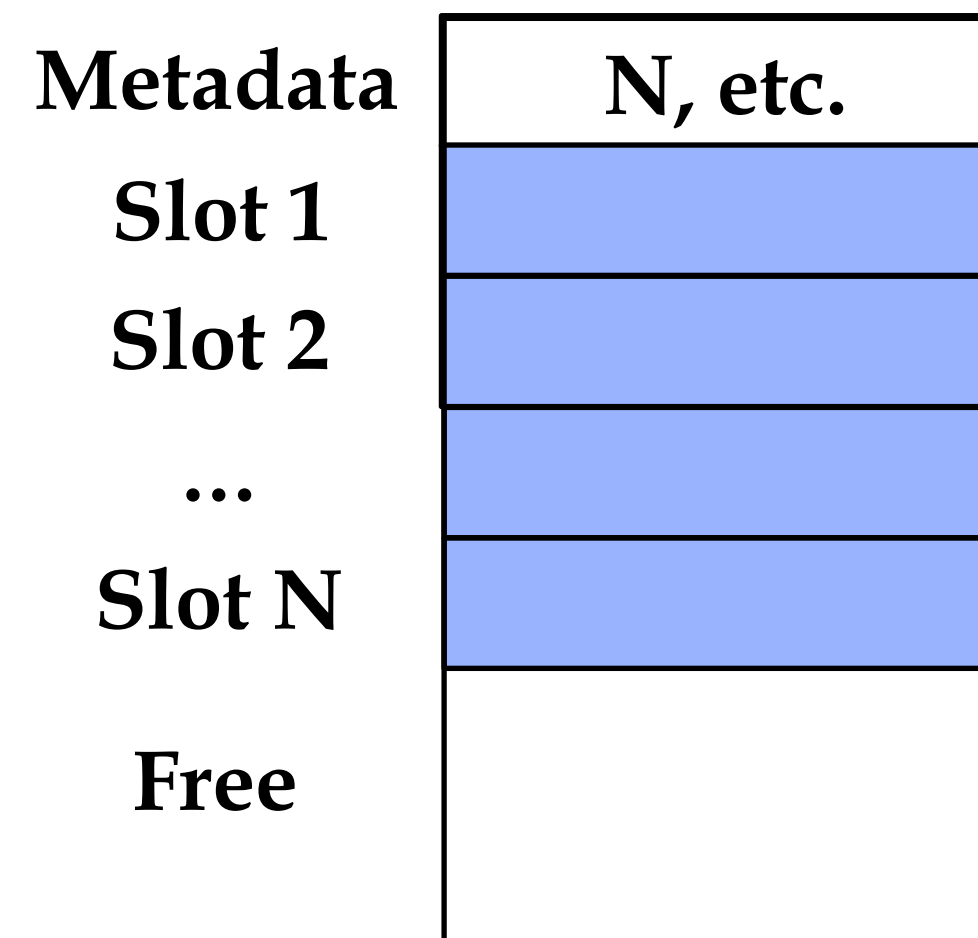
How to organize rows within a slot?

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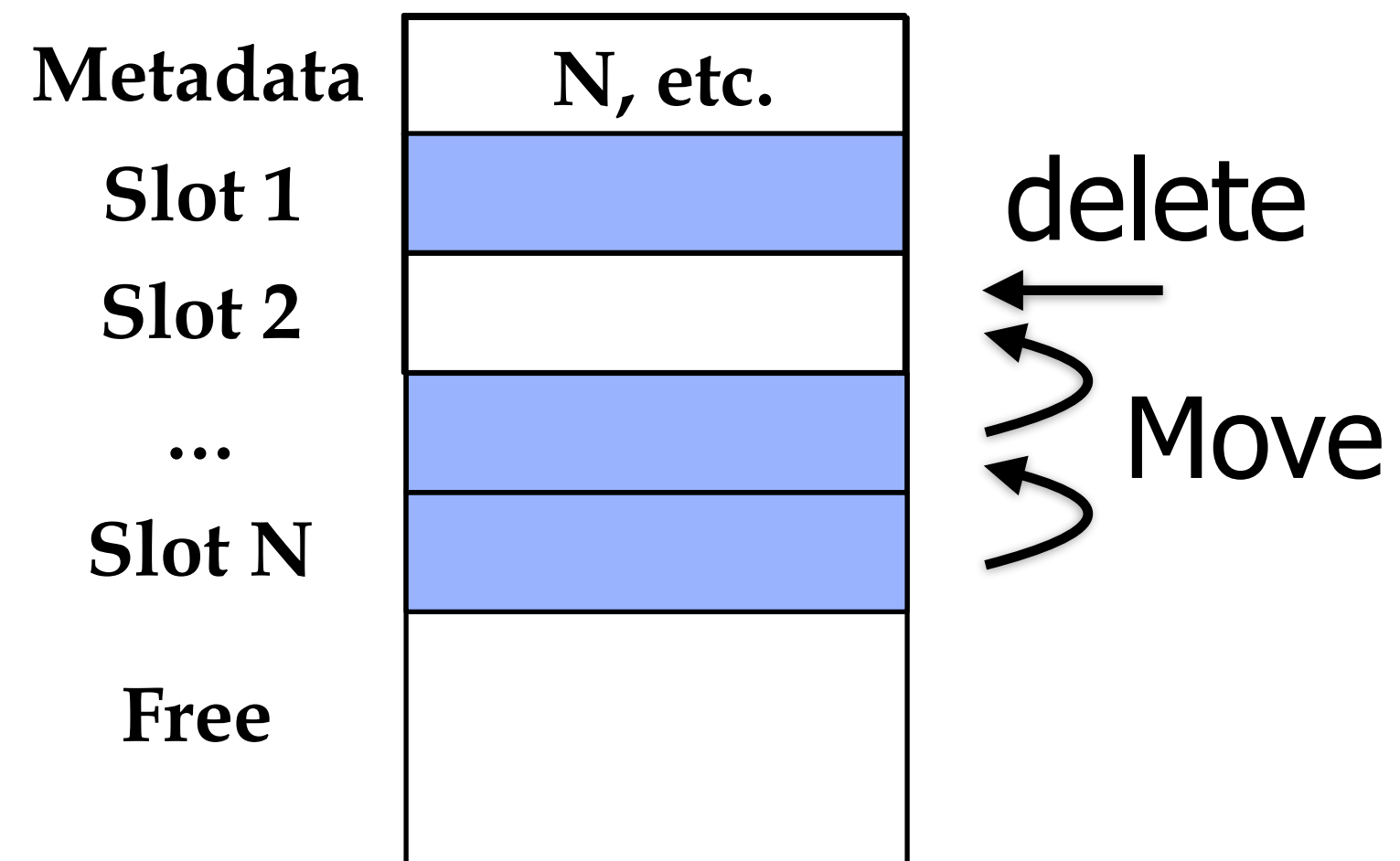


# Internal Page Organization

Recall each page is 4-8 KB

Suppose rows are fixed-sized

How to organize rows within a slot?



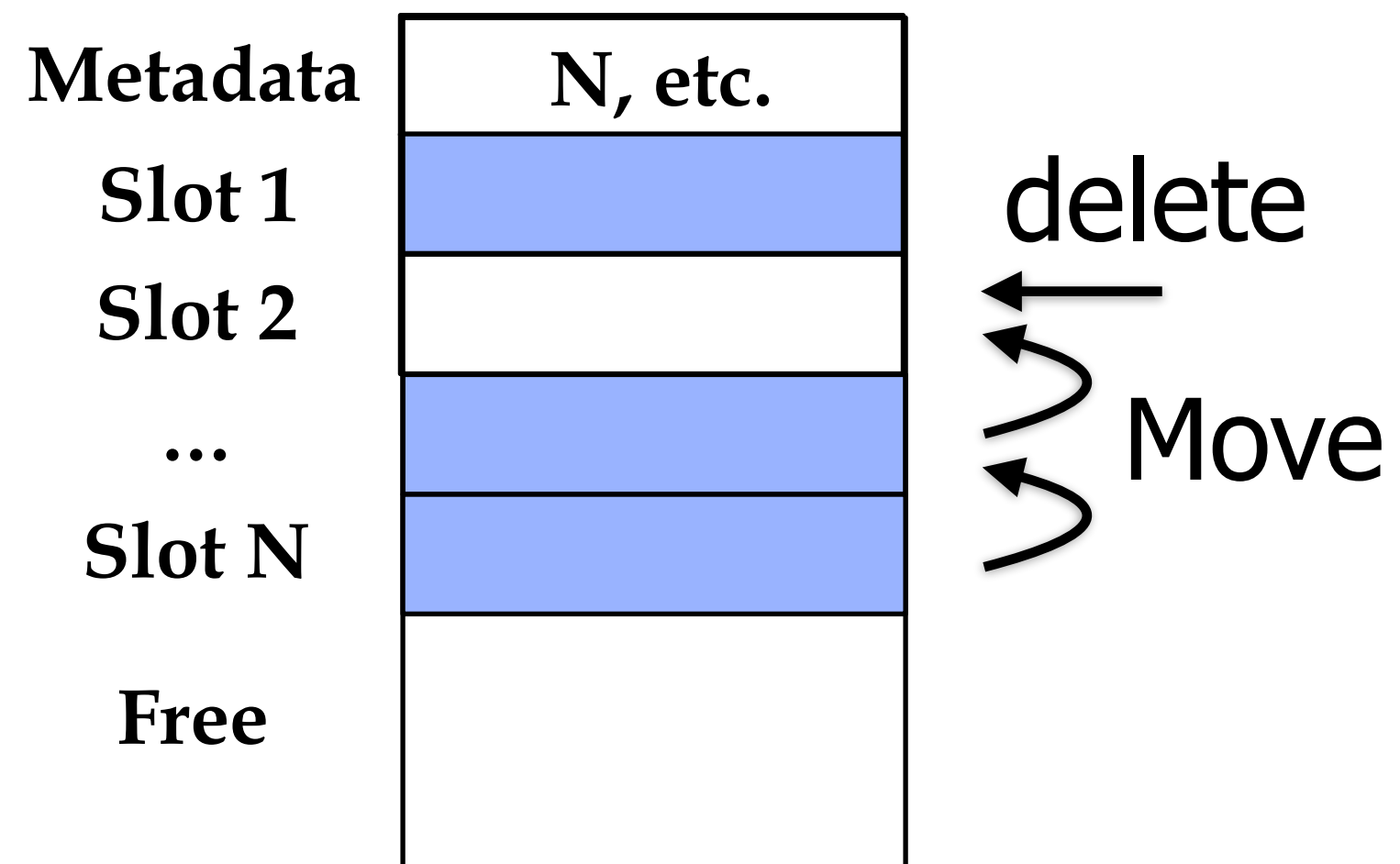
Need to reorganize due to deletes

# Internal Page Organization

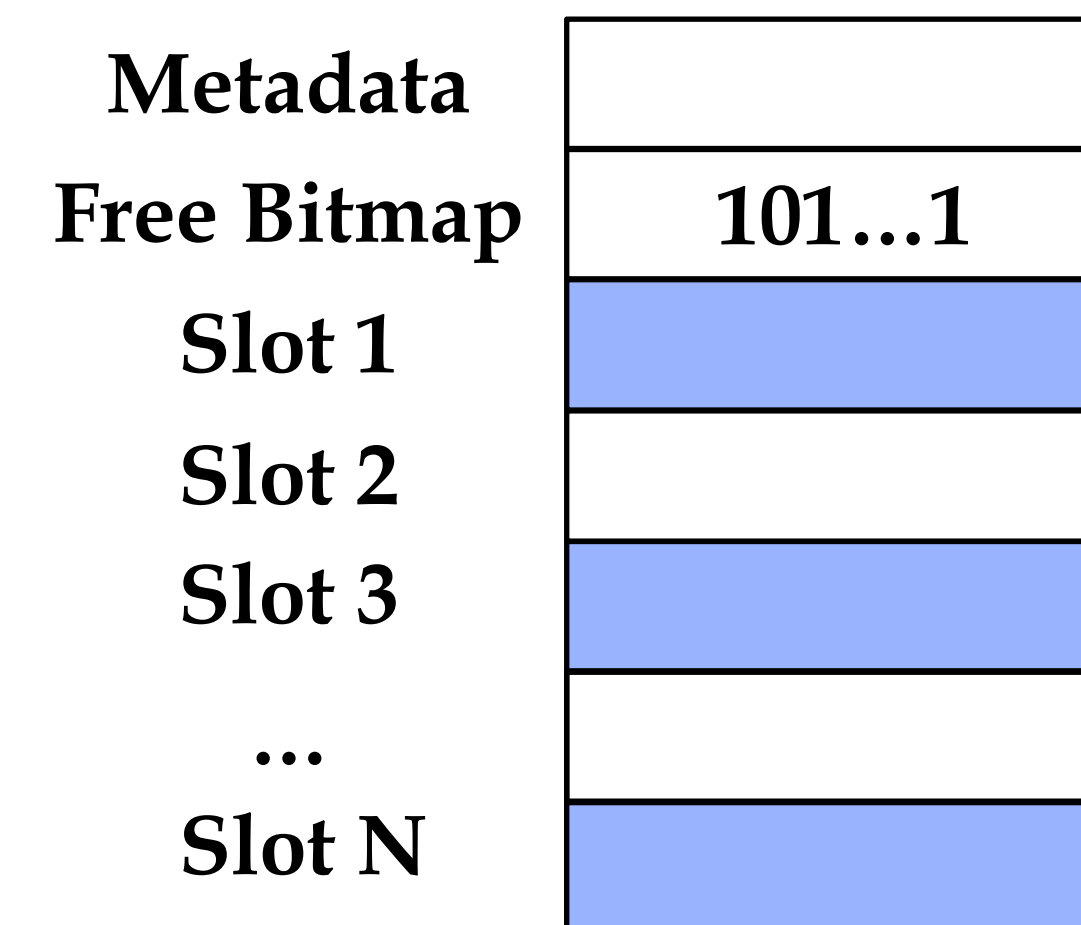
Recall each page is 4-8 KB

Suppose rows are fixed-sized

How to organize rows within a slot?



Need to reorganize due to deletes



No reorganization, requires more space

# Internal Page Organization

Recall each page is 4-8 KB

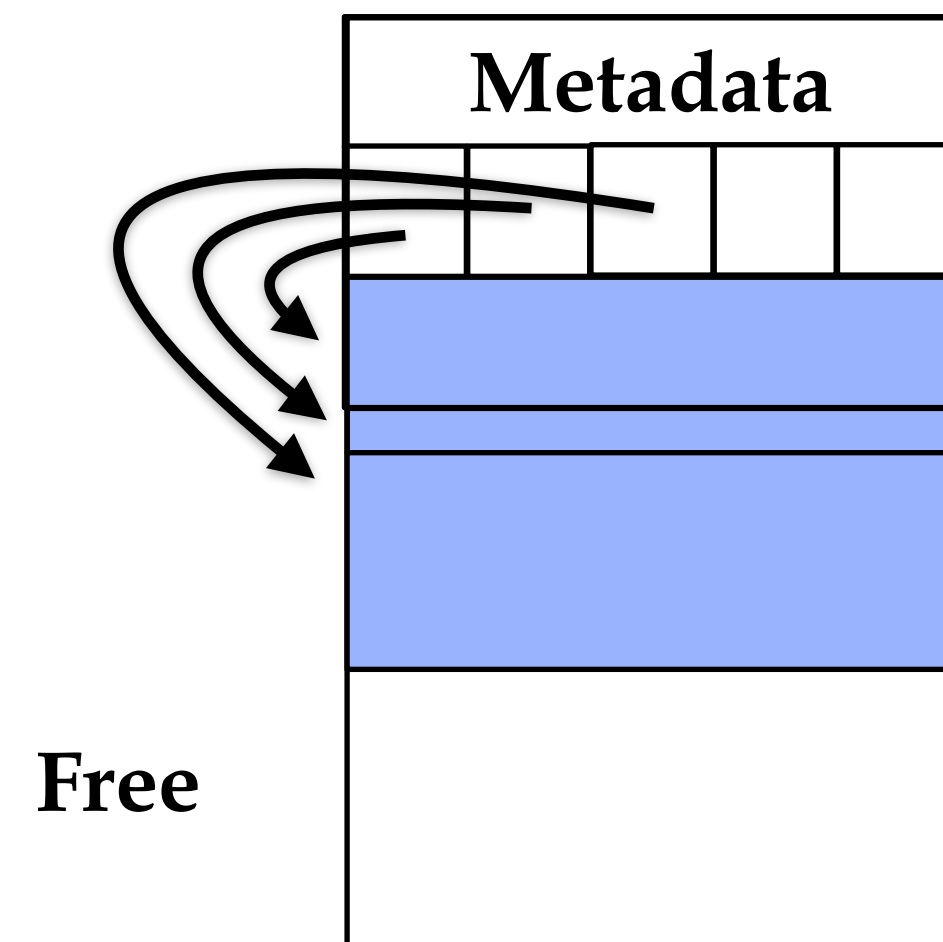
Suppose rows are **variable-length**

Solutions?

# Internal Page Organization

Recall each page is 4-8 KB

Suppose rows are **variable-length**

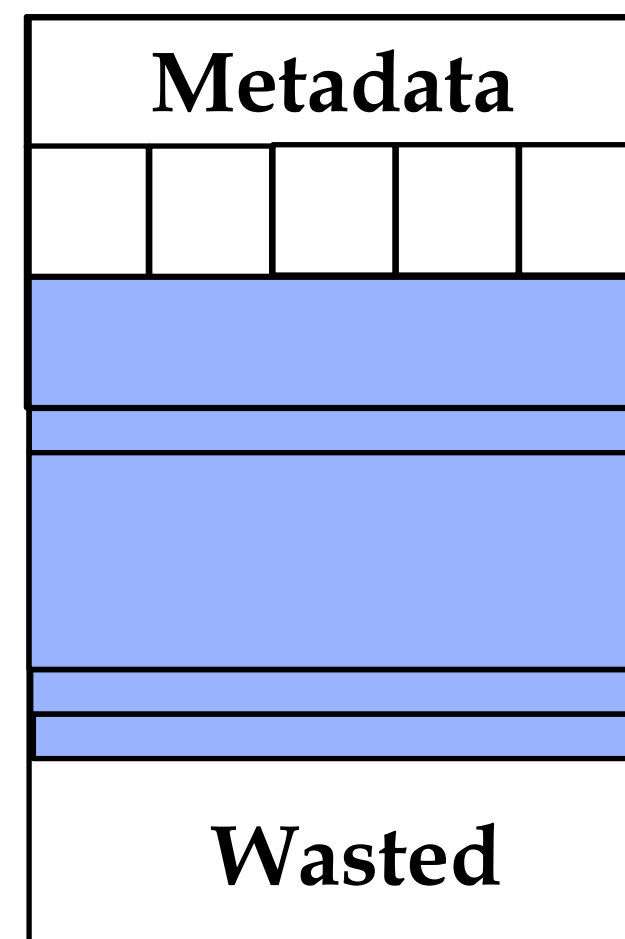




# Internal Page Organization

Recall each page is 4-8 KB

Suppose rows are **variable-length**

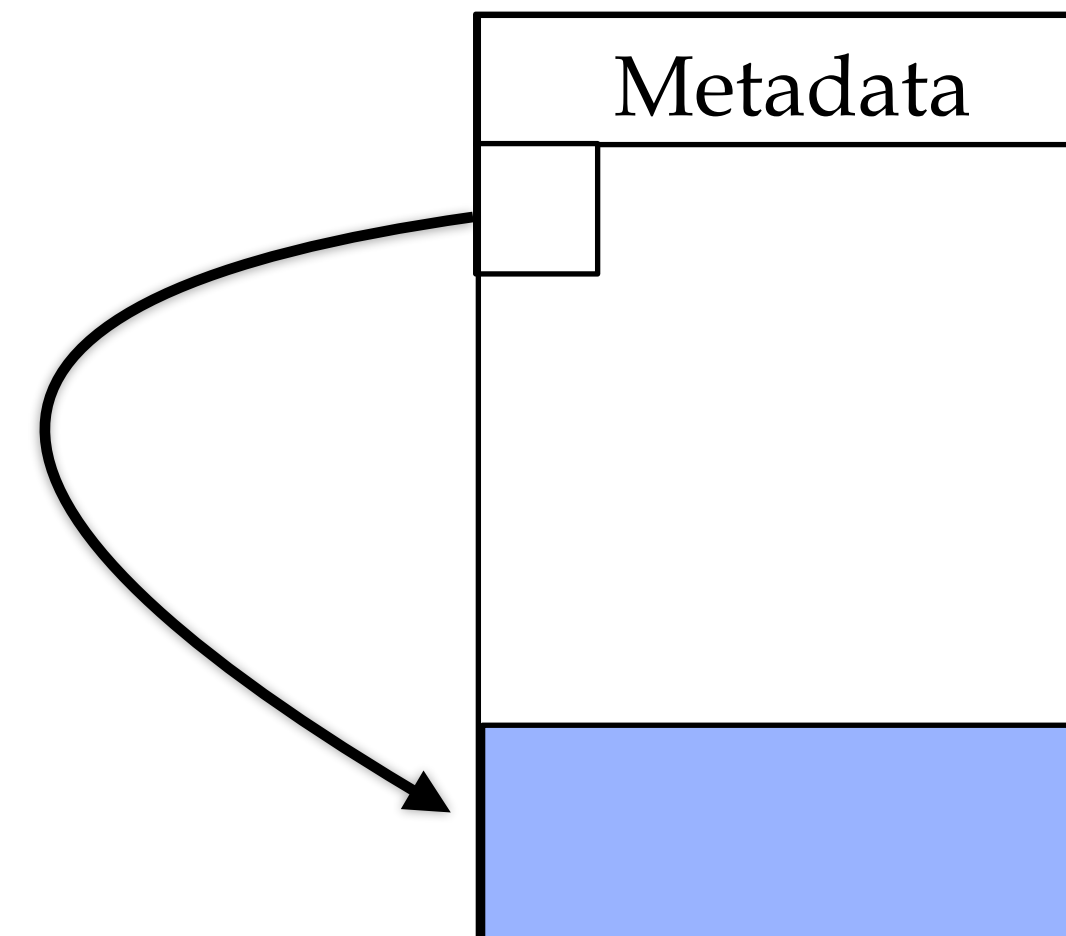
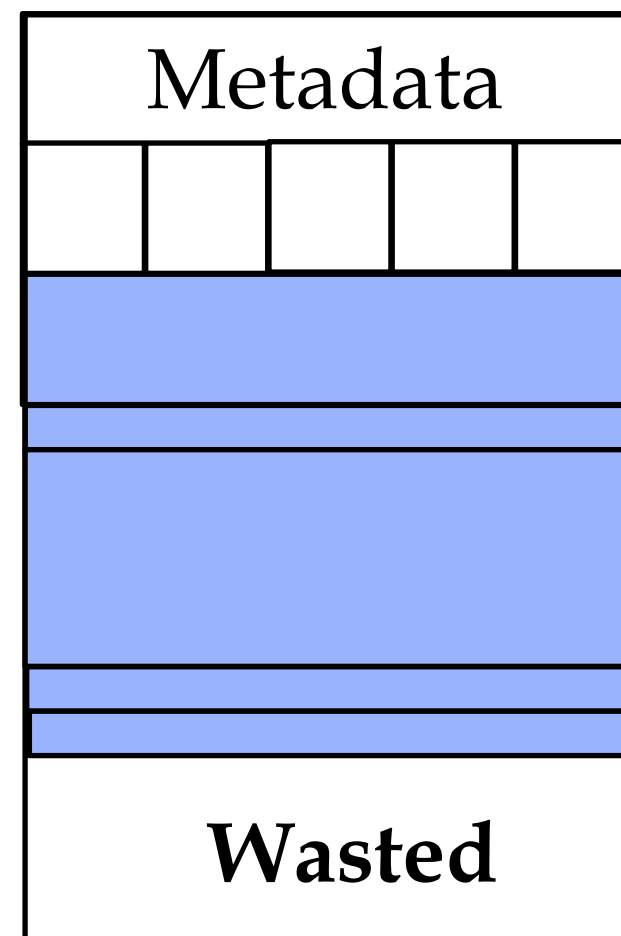


If entries are small, we waste space at the end, or we must push all content up to clear space

# Internal Page Organization

Recall each page is 4-8 KB

Suppose rows are **variable-length**

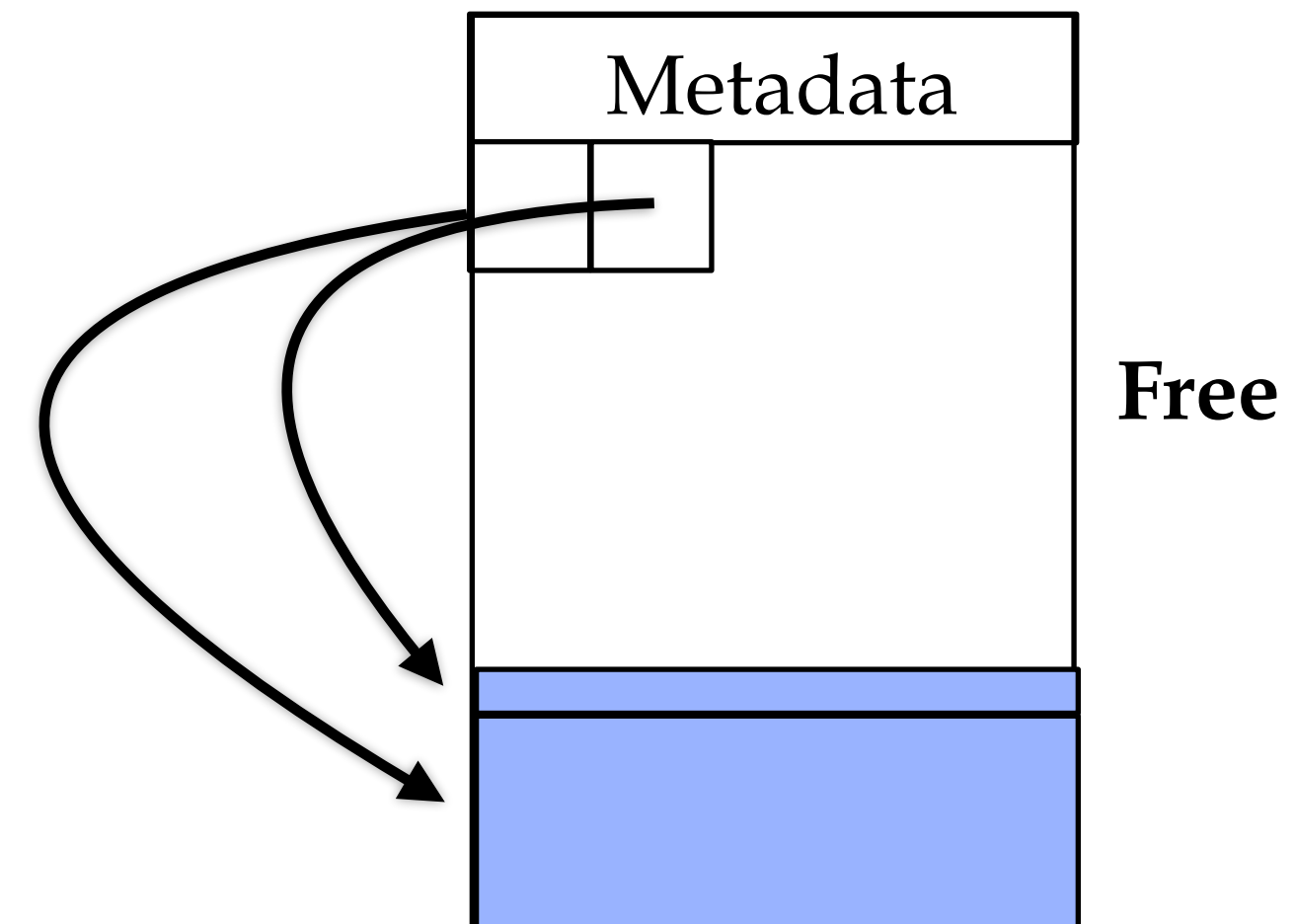
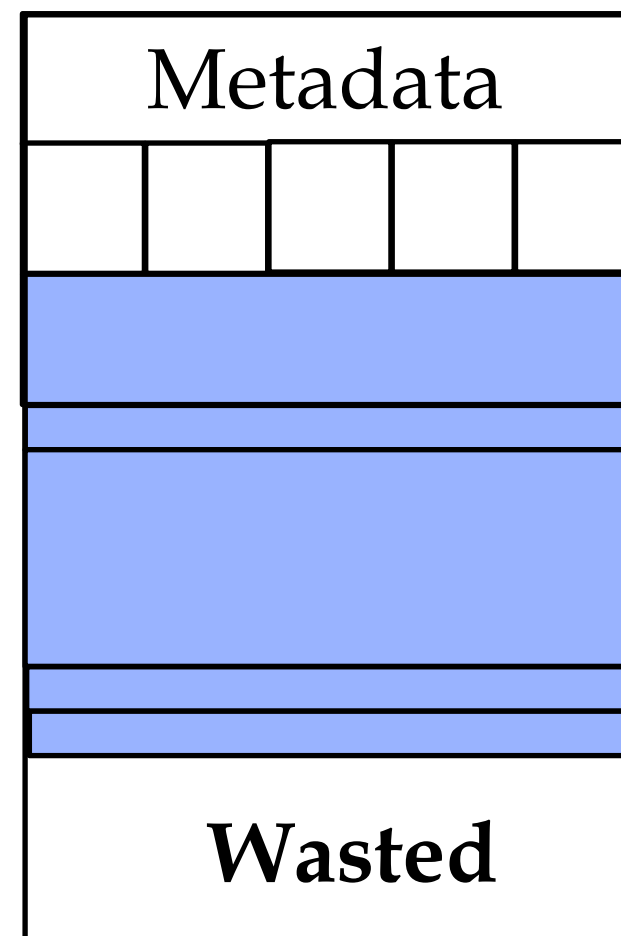


Store data from  
end of page

# Internal Page Organization

Recall each page is 4-8 KB

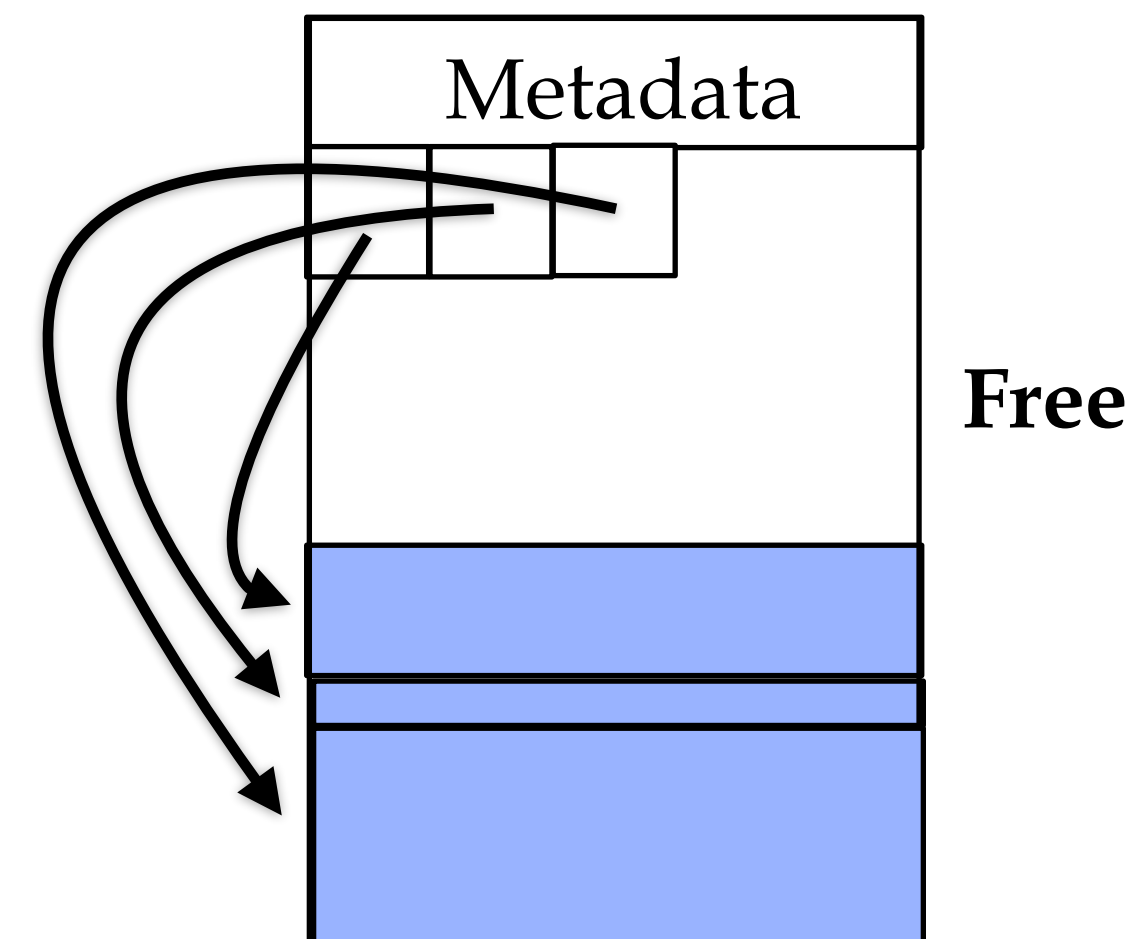
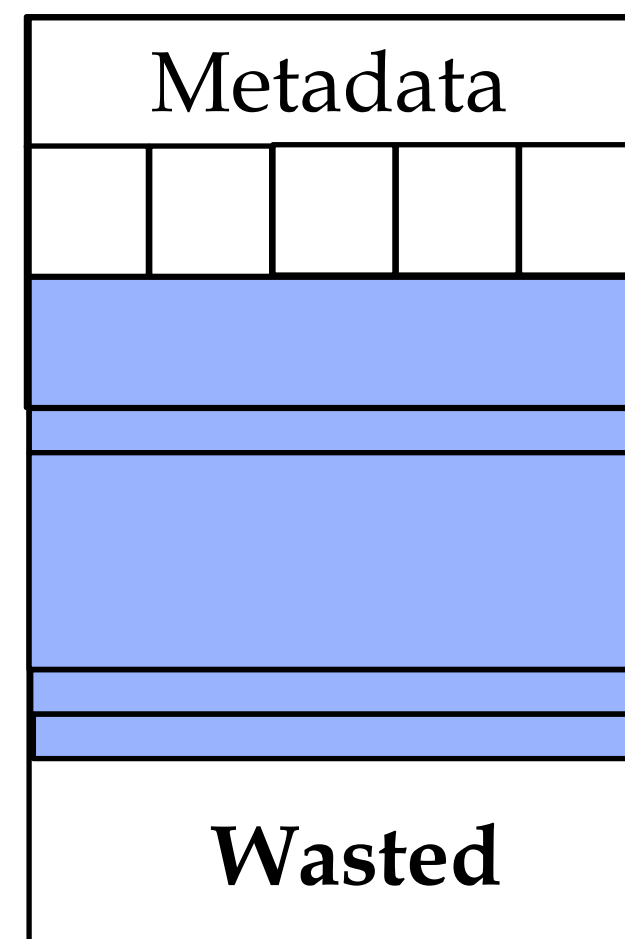
Suppose rows are **variable-length**



# Internal Page Organization

Recall each page is 4-8 KB

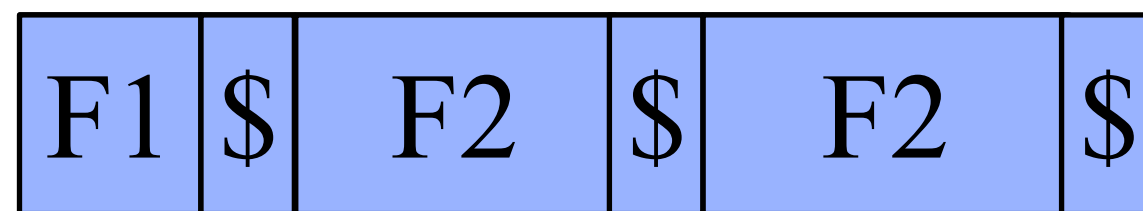
Suppose rows are **variable-length**



Minimal space wastage,  
and no need to move data

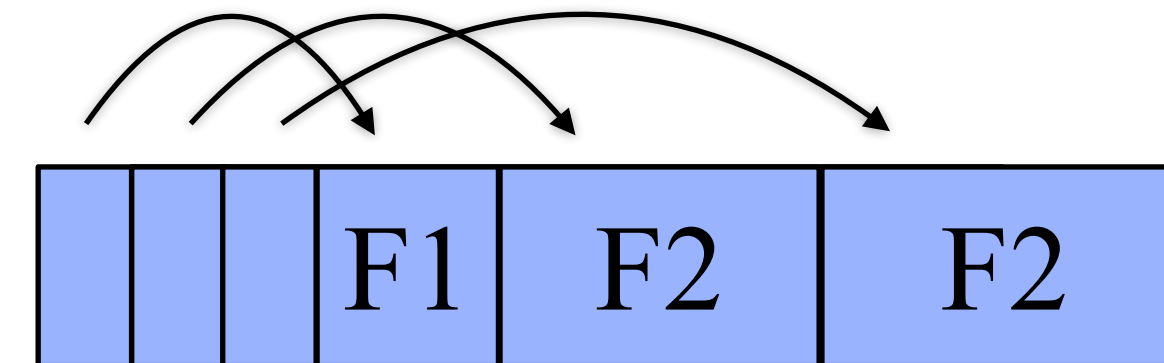
# Variable-Sized Record Organization

Delimiters



Smaller  
No random access

Pointers



More space  
Random access (faster)

Break

Then let's now move to buffer management