

# Distributed OLAP Systems



**Lecture #24**



**Database Systems**

15-445/15-645

Fall 2017



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Carnegie Mellon Univ.

# ADMINISTRIVIA

## Monday Dec 4<sup>th</sup> – NuoDB

→ Barry Morris (Co-Founder, Exec. Chairman)



## Wednesday Dec 6<sup>th</sup> – Potpourri + Final Review

→ Vote for what system you want me to talk about.

→ <http://cmudb.io/f17-systems>

## Wednesday Dec 6<sup>th</sup> – Project #4



# OLTP VS. OLAP

## On-line Transaction Processing (OLTP):

- Short-lived txns.
- Small footprint.
- Repetitive operations.

## On-line Analytical Processing (OLAP):

- Long running queries.
- Complex joins.
- Exploratory queries.



# TODAY'S AGENDA

Partitioning

Distributed Join Algorithms



# DATABASE PARTITIONING

Split database across multiple resources:

- Disks, nodes, processors.
- Sometimes called "sharding"

The DBMS executes query fragments on each partition and then combines the results to produce a single answer.



# NAÏVE TABLE PARTITIONING

Each node stores one and only table.  
Assumes that each node has enough storage space for a table.



# NAÏVE TABLE PARTITIONING

Table1


Table2


Partitions



Ideal Query:

```
SELECT * FROM table
```

# NAÏVE TABLE PARTITIONING

Table1

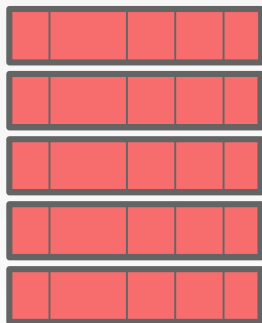
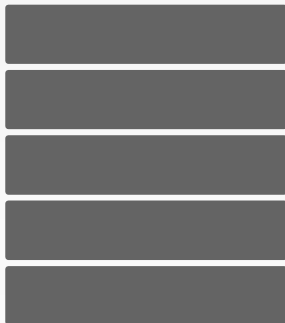


Table2



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# NAÏVE TABLE PARTITIONING

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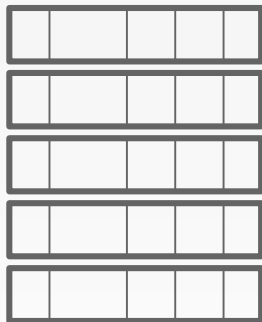
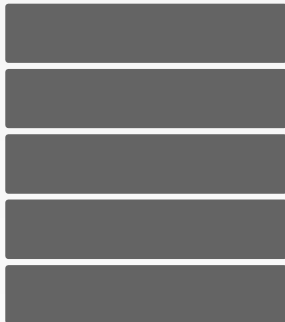
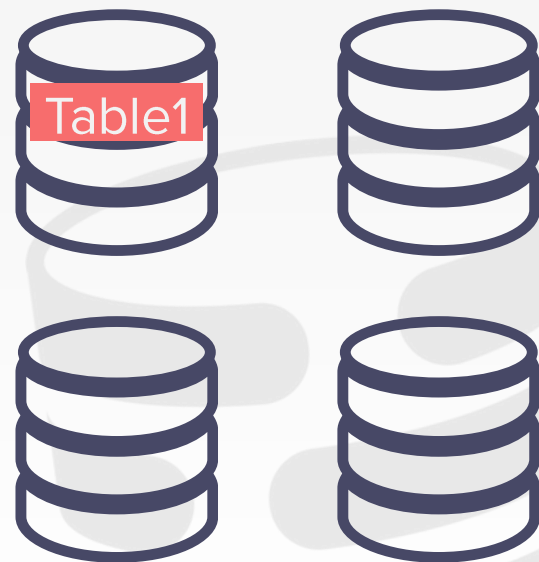


Table2



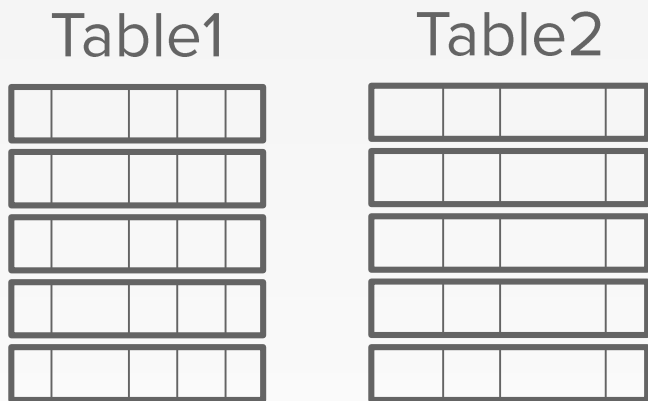
Partitions



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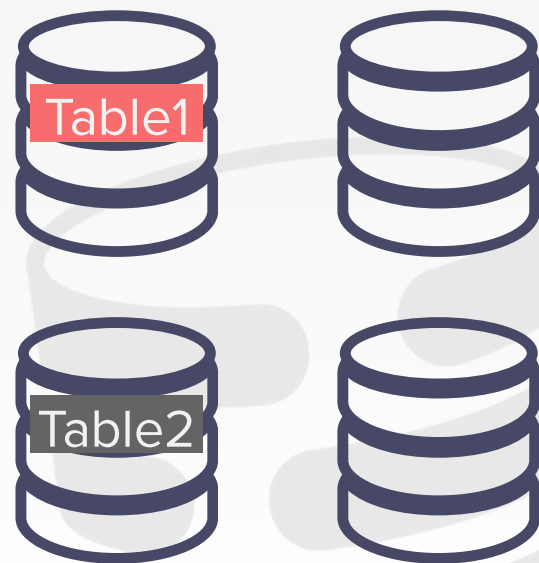
# NAÏVE TABLE PARTITIONING



Ideal Query:

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SELECT * FROM table
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Partitions



# HORIZONTAL PARTITIONING

Split a table's tuples into disjoint subsets.

- Choose column(s) that divides the database equally in terms of size, load, or usage.
- Each tuple contains all of its columns.
- Hash Partitioning, Range Partitioning

The DBMS can partition a database **physical** (shared nothing) or **logically** (shared disk).



# HORIZONTAL PARTITIONING

Partitioning Key

Table1

101	a	XXX	2017-11-29
102	b	XXY	2017-11-28
103	c	XYZ	2017-11-29
104	d	XYX	2017-11-27
105	e	XYY	2017-11-29

Ideal Query:

```
SELECT * FROM table
WHERE partitionKey = ?
```

Partitions



# HORIZONTAL PARTITIONING

Partitioning Key

Table1

101	a	XXX	2017-11-29	$\text{hash}(a)\%4 = P2$
102	b	XXY	2017-11-28	$\text{hash}(b)\%4 = P4$
103	c	XYZ	2017-11-29	$\text{hash}(c)\%4 = P3$
104	d	XYX	2017-11-27	$\text{hash}(d)\%4 = P2$
105	e	XYX	2017-11-29	$\text{hash}(e)\%4 = P1$

Ideal Query:

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Partitions



# HORIZONTAL PARTITIONING

Partitioning Key

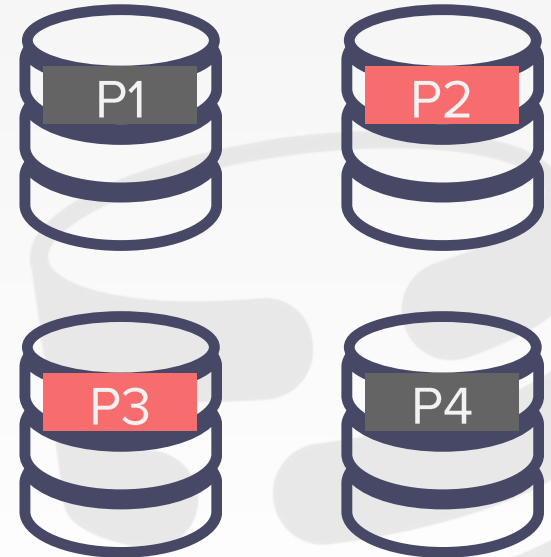
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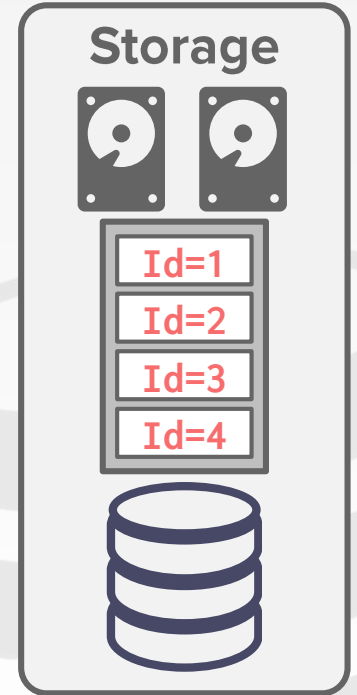
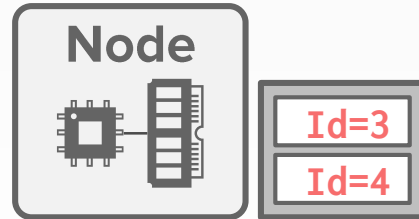
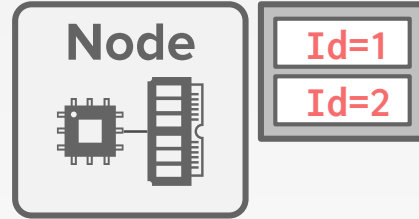
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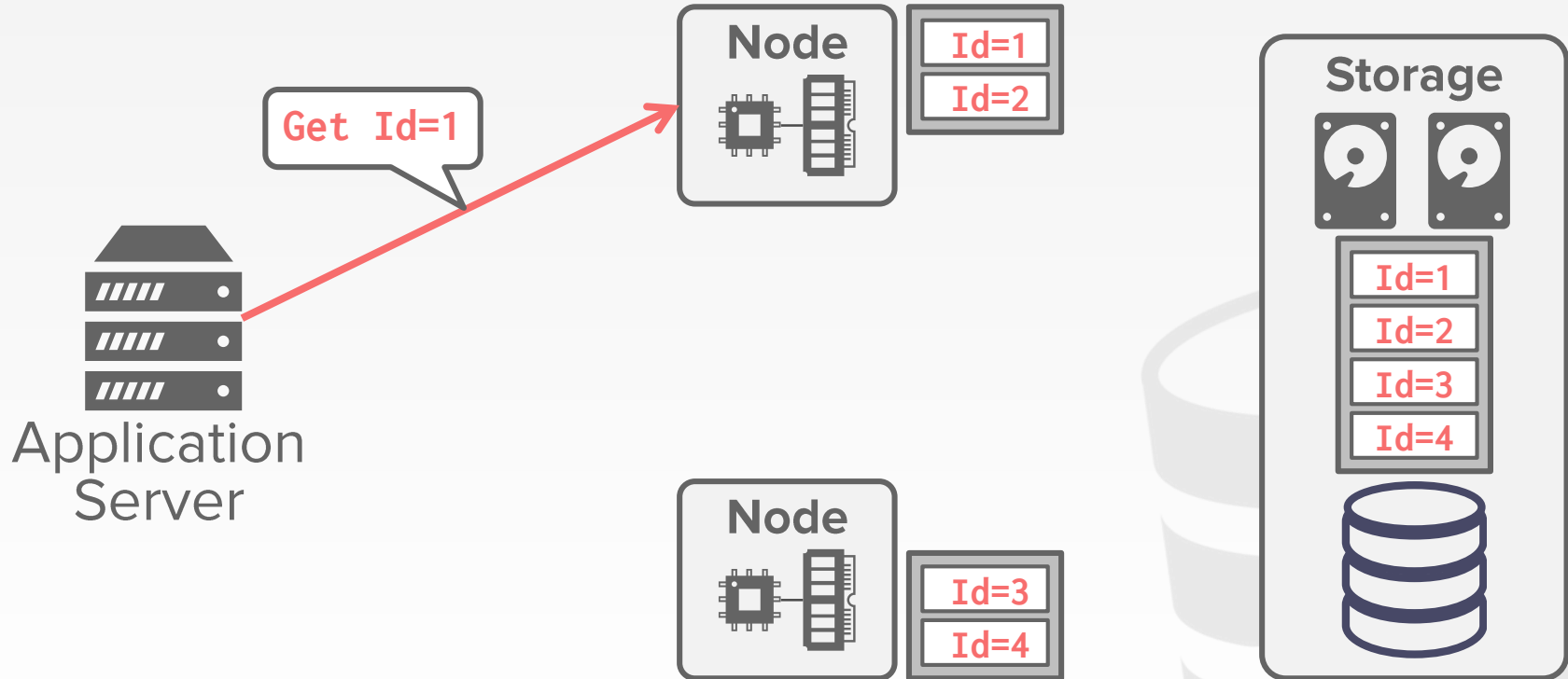
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# LOGICAL PARTITIONING

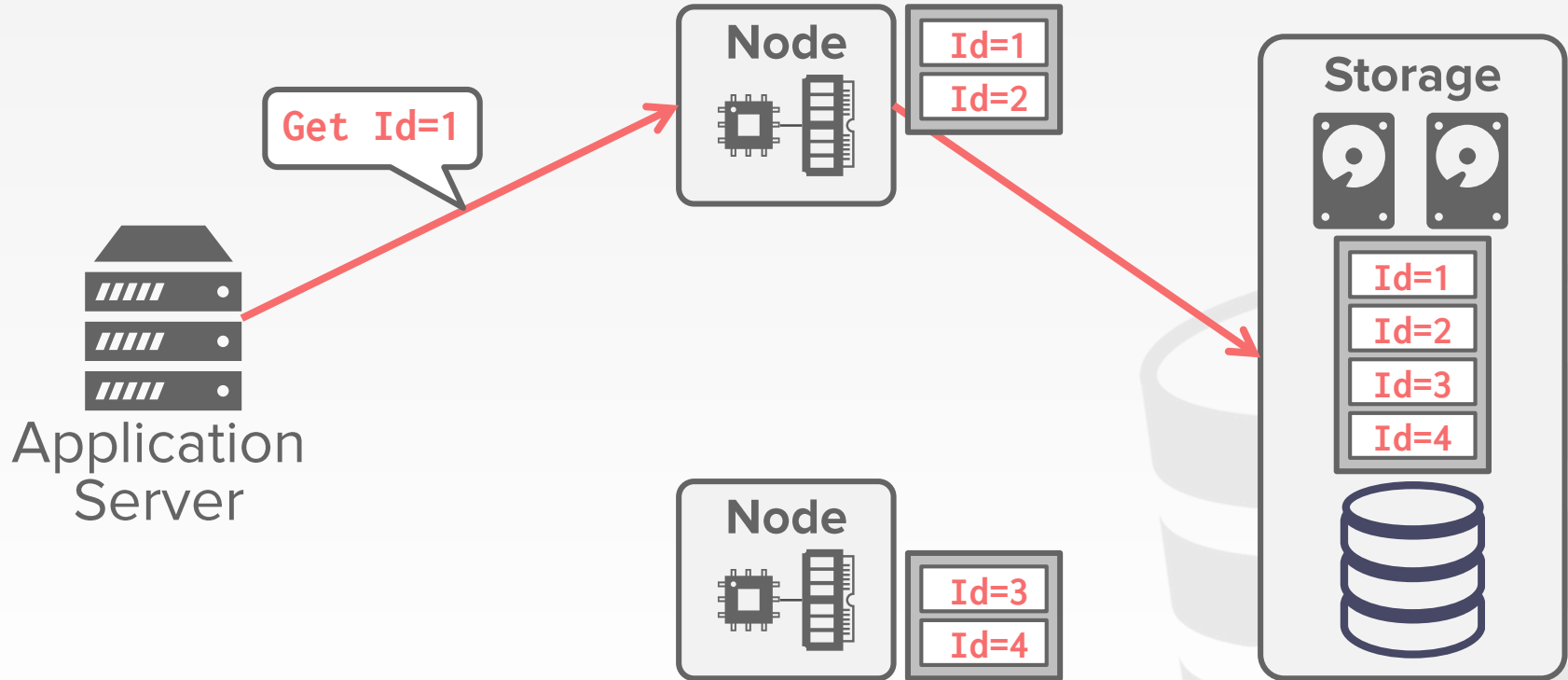


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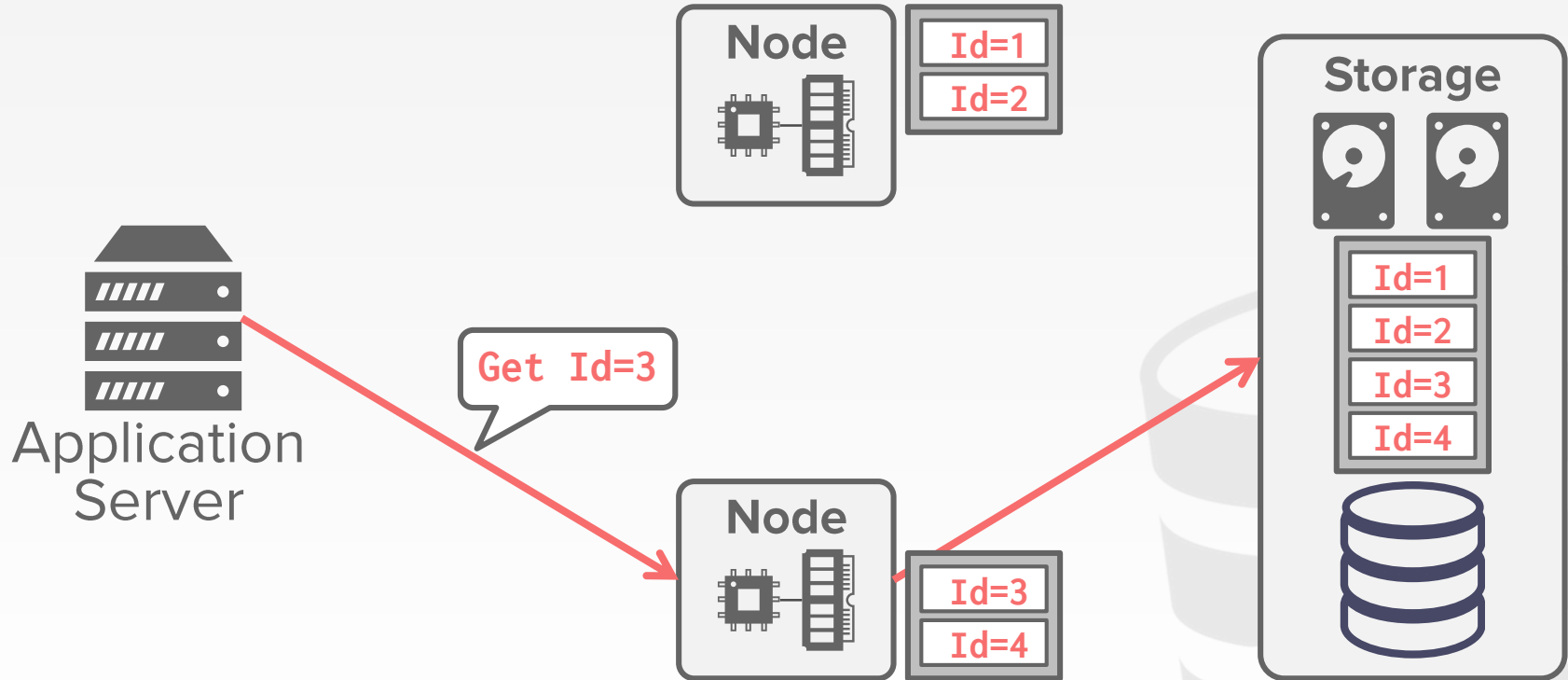




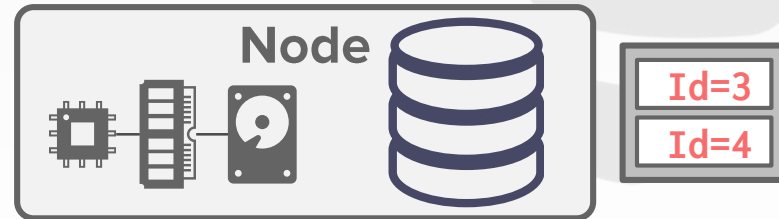
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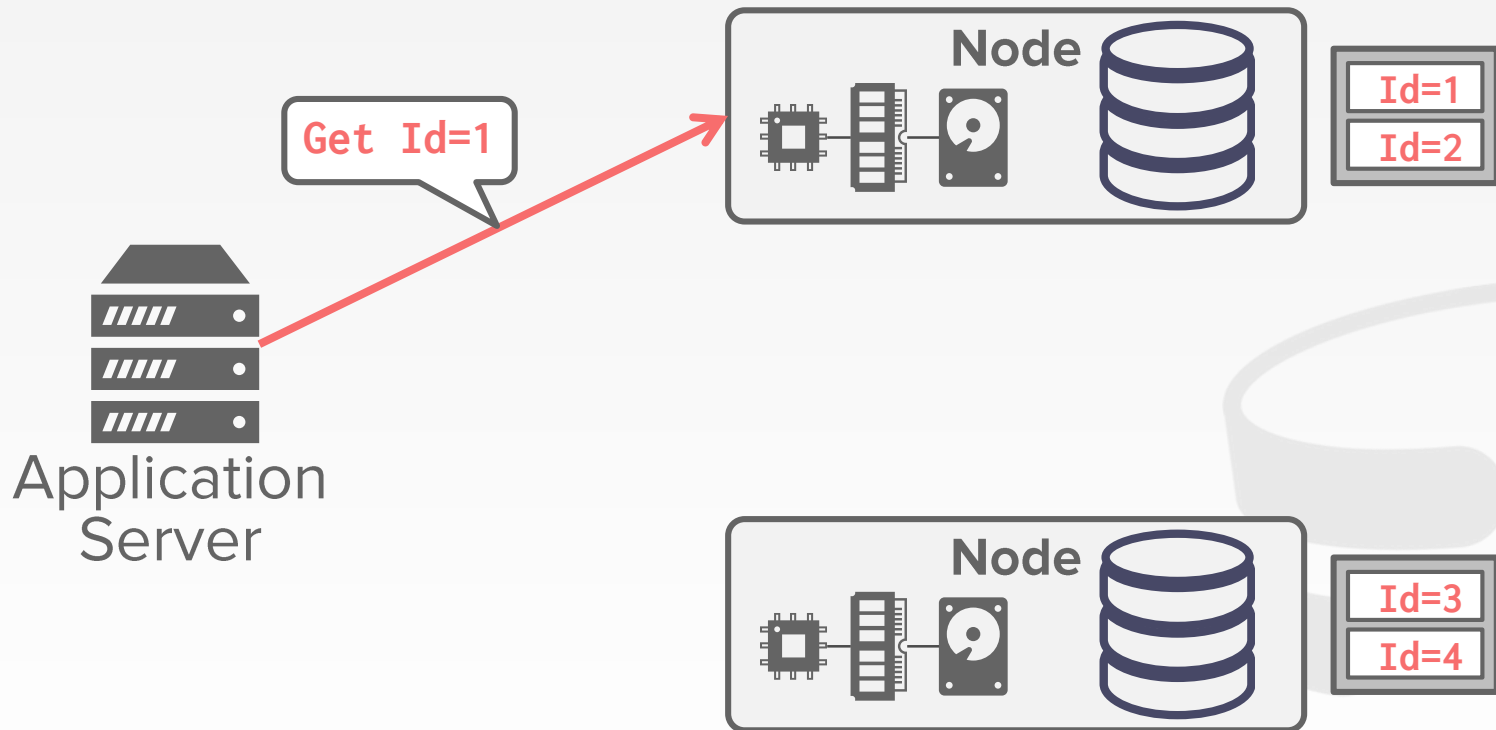
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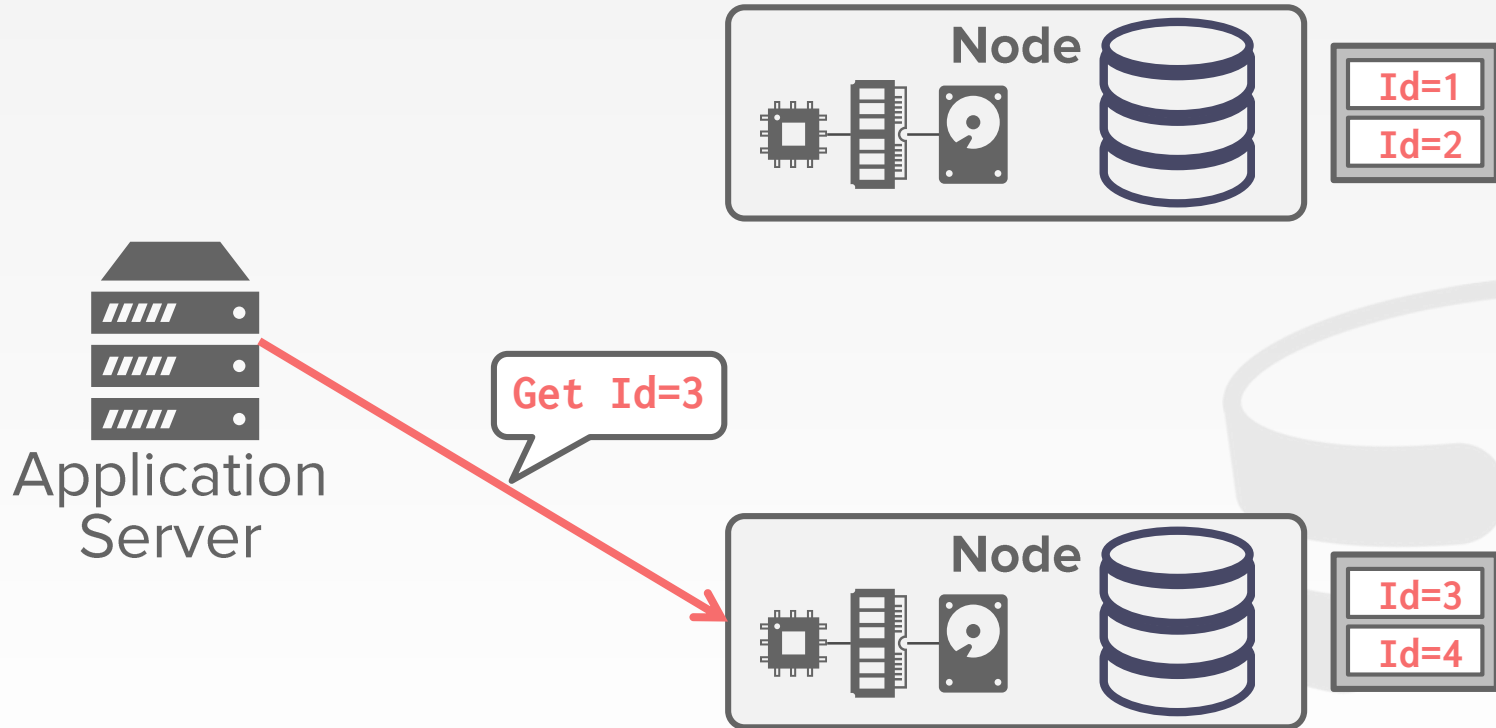
# PHYSICAL PARTITIONING



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# OBSERVATION

The efficiency of a distributed join depends on the target tables' partitioning schemes.

One approach is to put entire tables on a single node and then perform the join.

- You lose the parallelism of a distributed DBMS.
- Costly data transfer over the network.



# DISTRIBUTED JOIN ALGORITHMS

To join tables **A** and **B**, the DBMS needs to get the proper tuples on the same node.

Once there, it then executes the same join algorithms that we discussed earlier in the semester.



# SCENARIO #1

One table is replicated at every node.  
Each node joins its local data and then  
sends their results to a coordinating node.

```
SELECT * FROM T1, T2  
WHERE T1.id = T2.id
```

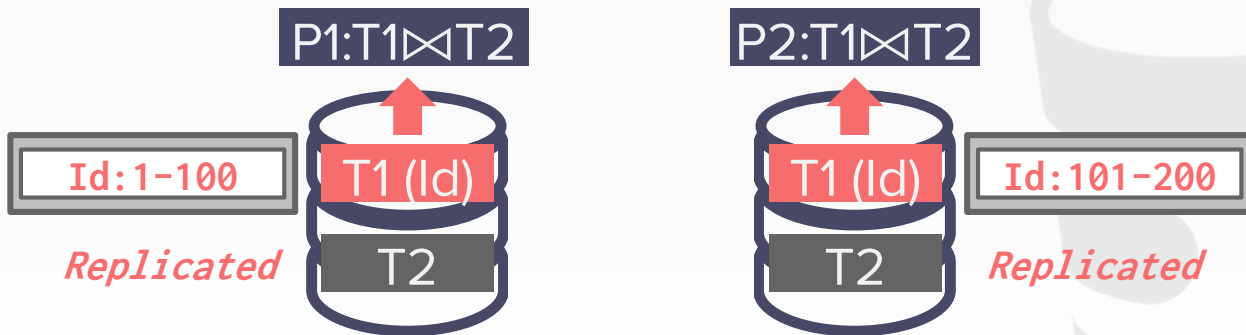




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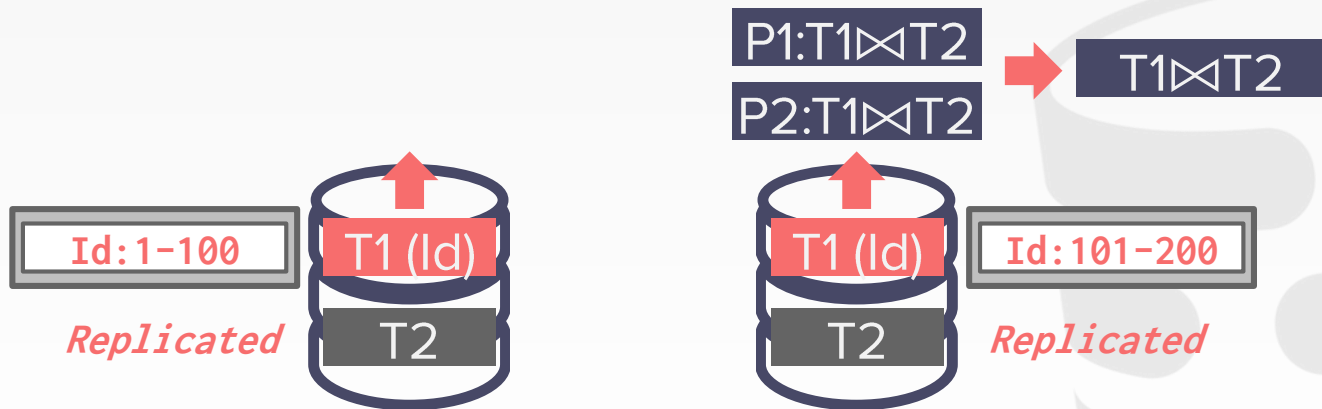
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## SCENARIO #2

Tables are partitioned on the join attribute.  
Each node performs the join on local data  
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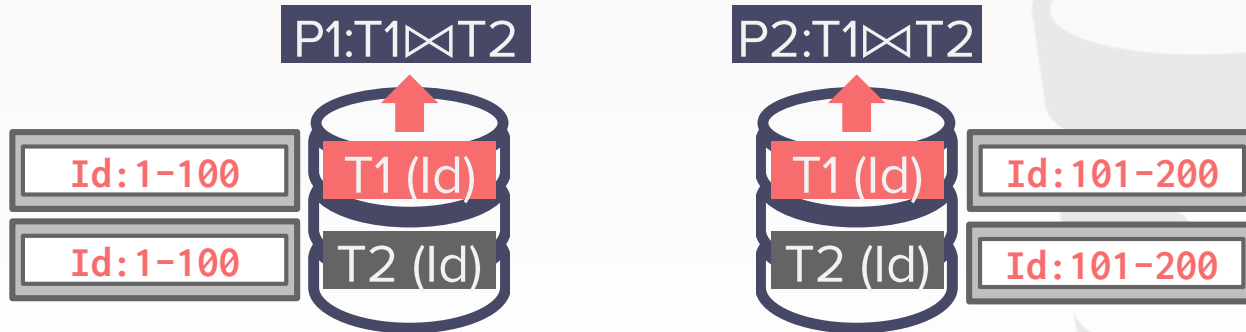
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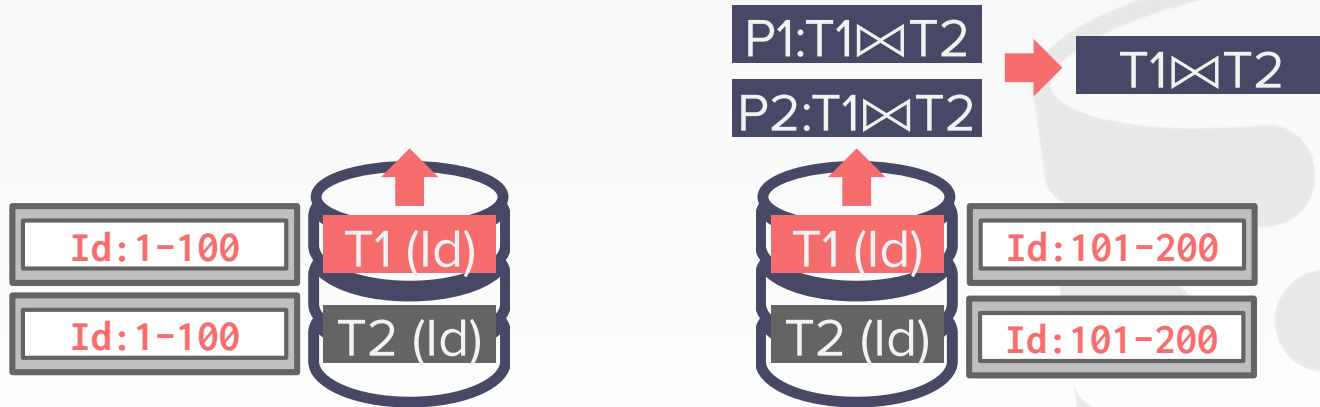
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# SCENARIO #3

Both tables are partitioned on different keys. If one of the tables is small, then the DBMS **broadcasts** that table to all nodes.

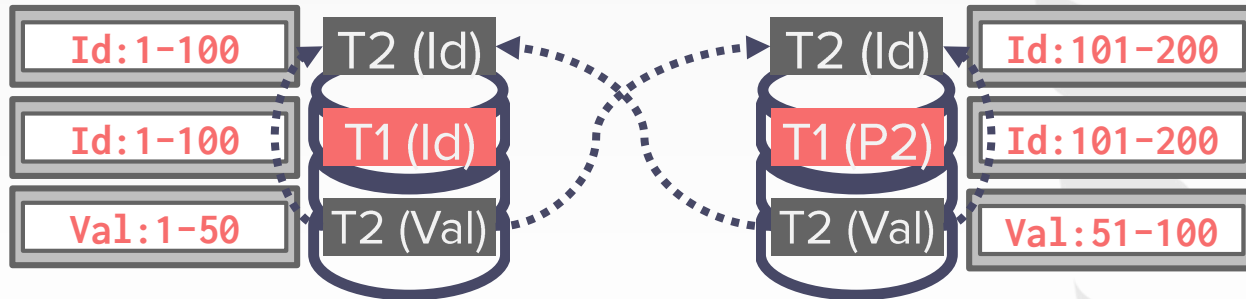
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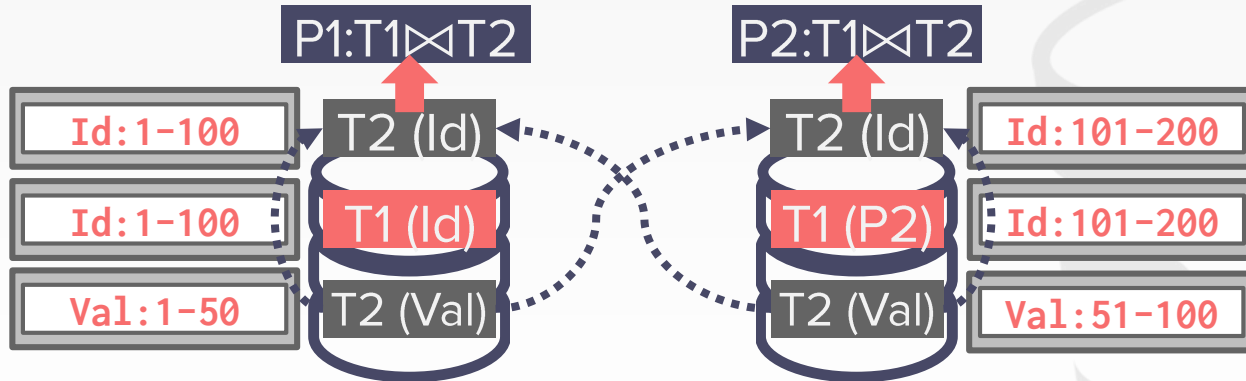
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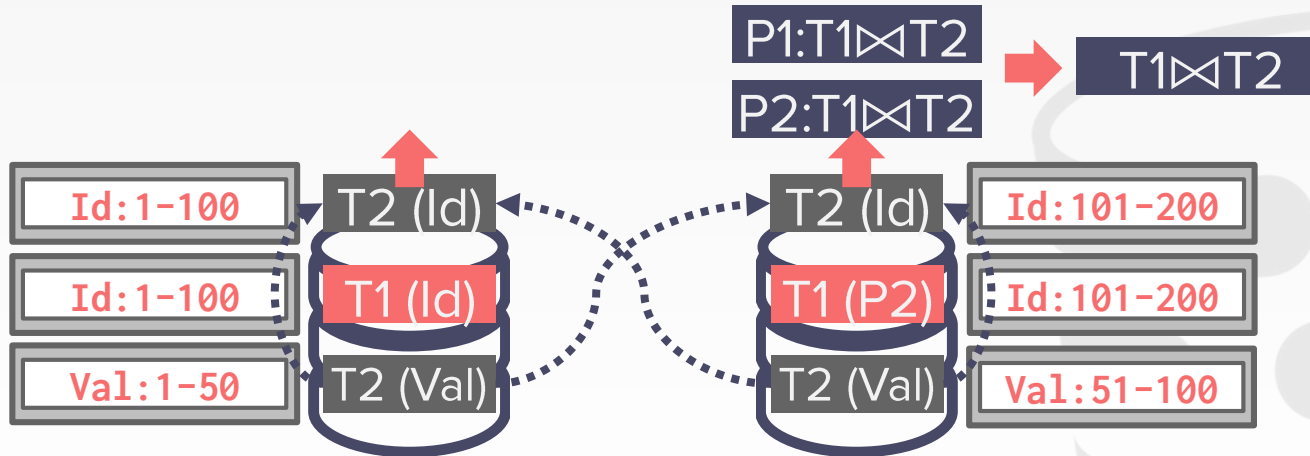




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# SCENARIO #4

Both tables are not partitioned on the join key. The DBMS copies the tables by **reshuffling** them across nodes.

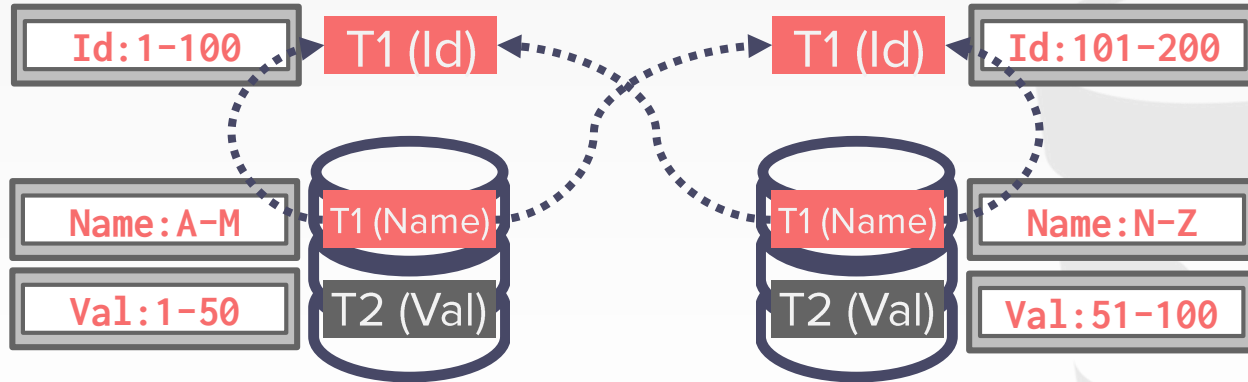
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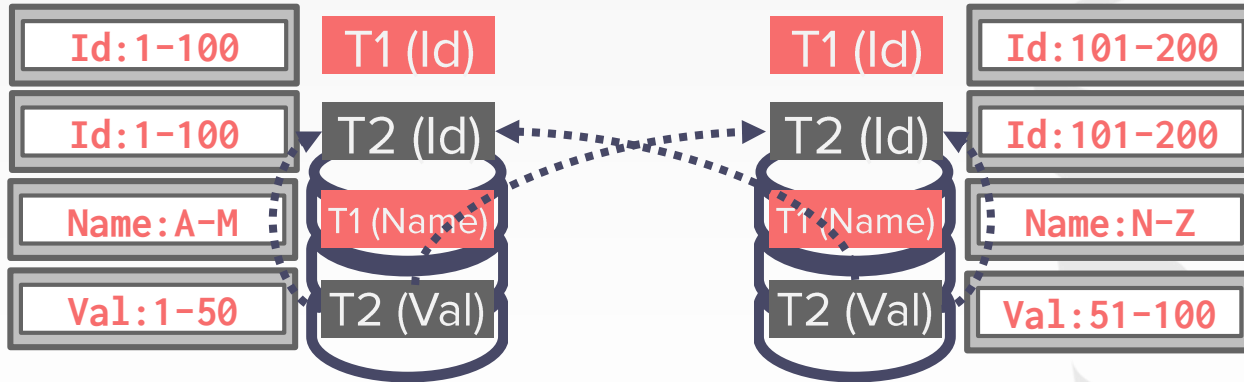
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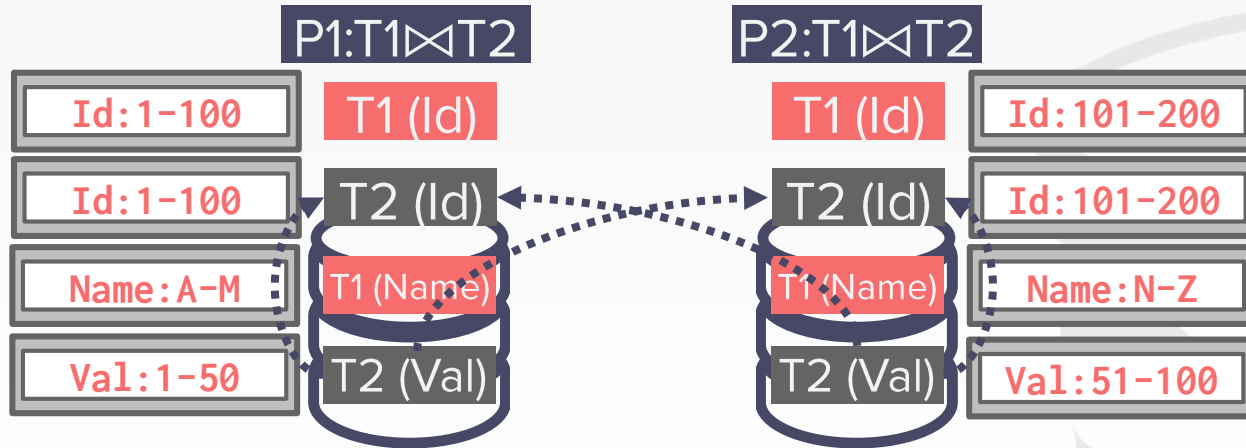
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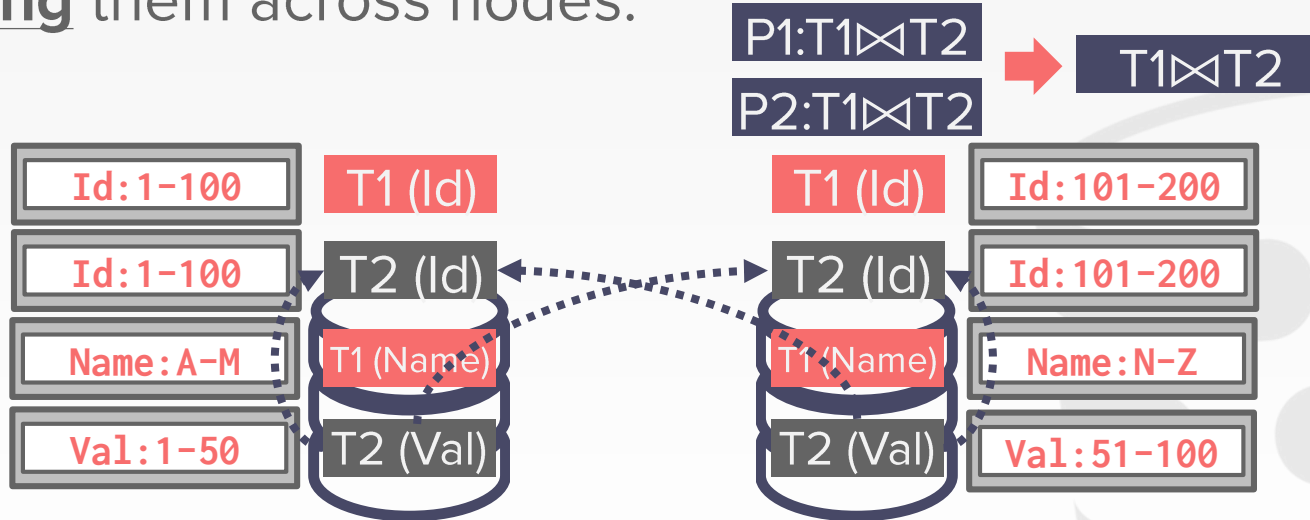
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# CONCLUSION

Again, efficient distributed OLAP systems are difficult to implement.

Whenever possible, you want to push the query to the data rather than pull the data to the query.



# NEXT CLASS

NuoDB!

