

# Key Concepts

Massively Parallel Processing with the Microsoft Analytics Platform System



# Agenda

- APS in a nutshell
- Appliance vs. Reference Architecture
- Scale up vs. Scale out
- Elements of MPP Database Systems
- Skew
- Parallelism
- Agnostic in the Enterprise

### APS in a Nutshell

# The Engine for Warehousing & Analytics

- Built for scale out warehousing and analytics
- Deep, native integration with Hadoop
- High performance data loading platform
- Concurrent data warehouse workload pattern
  - Load
  - Query

# Much more than simply SQL Server

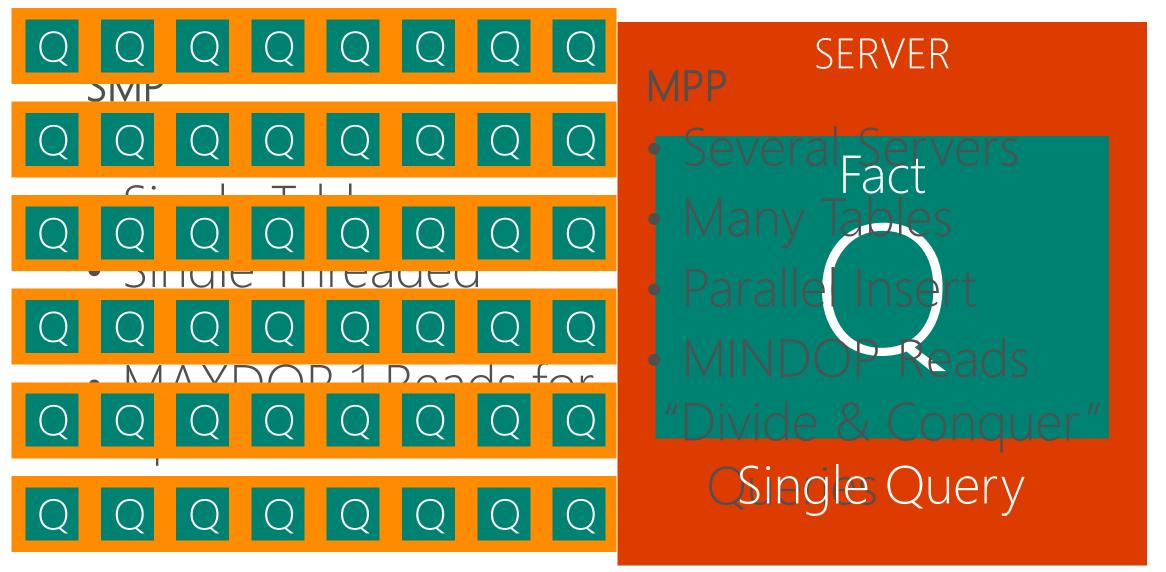
### SQL Server plus

- Hardware
- Additional PDW specific software
- Hadoop integration
- Built-in development of engineering Best Practices
- Integrated systems management

### New features come first to APS

- Updateable column store
- Agnostic Hadoop integration via PolyBase
- Cardinality estimation
- Cost-based distributed SQL Query (DSQL) engine
- Hub and spoke architecture support
- Analytical functions (e.g. LAG and LEAD)
- Incremental functional releases each year

# It's parallel all the time, every time



# Appliances



# What is an appliance?

Think about buying a kettle...

- Performs a specific function
  - boils water
- Tuned for that function doesn't heat soup



# Appliance buying process

#### Research your kettle

- Performance
- Aesthetics
- Compatibility
- Placing an order
- Wait for delivery

### Post-delivery

- Unbox
- Plug it in
- Activate warranty

### Use it!

Remember: only boil water, don't heat soup!

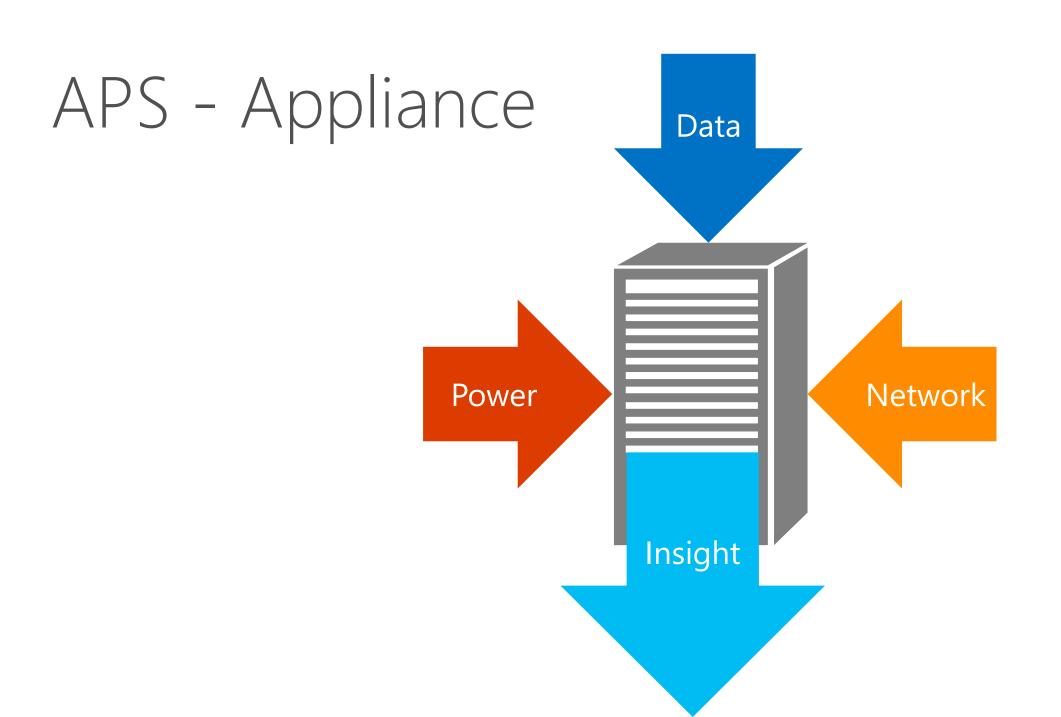
# What happens if...

I want to boil water faster

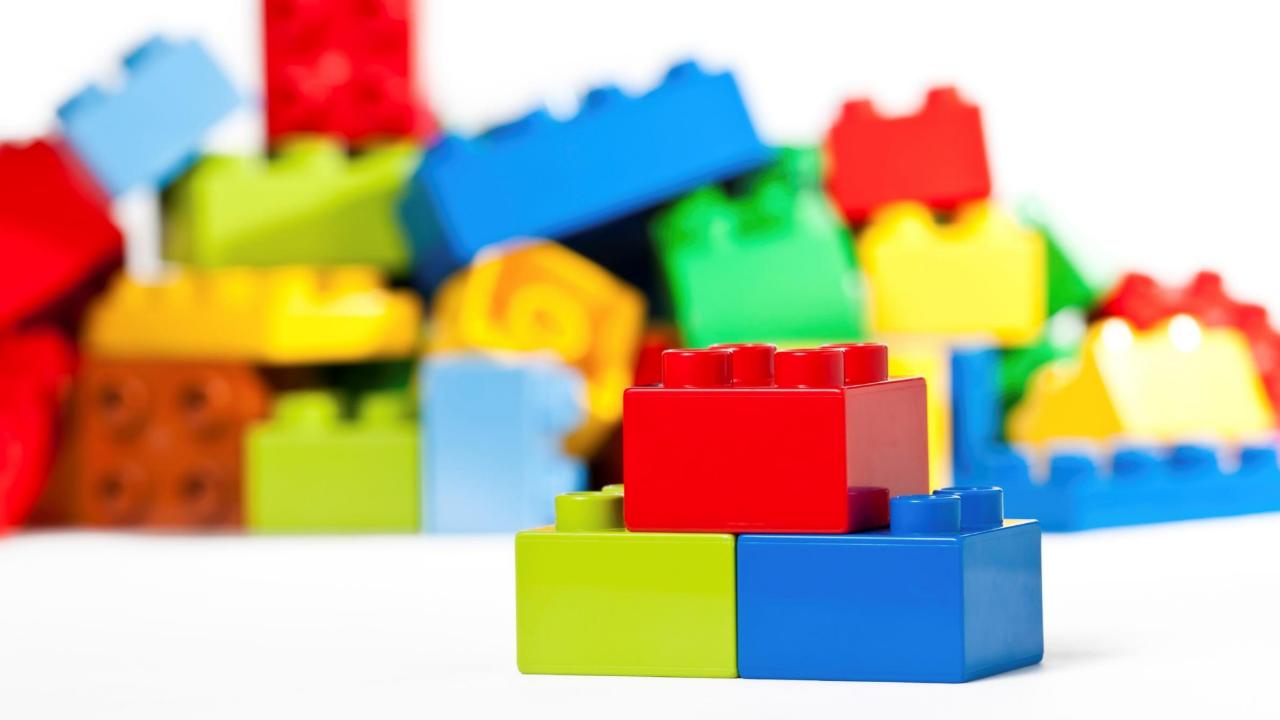
- Do: buy a better kettle
- Don't: reach for the screwdriver...

Kettle breaks

Activate warranty



### Reference Architectures



### What is a Reference Architecture?

Think about building with Lego

- You get the bricks
- You get the instructions
- You do the build
- If you follow the instructions you get the product you purchased
- If you don't...you get what you built



# Symmetric Multi-Processing

### SMP - Definition

- Two or more multi-processors (CPUs or cores)
- Connected to a single shared memory
- Full access to all I/O devices
- Shared main/motherboard
- Known as "Scaling Up"

# SMP - Examples



#### Shared resources

Good for joins

Bad for bottlenecks



# Massively Parallel Processing



### What is MPP?

- A divide and conquer strategy
- Take one big problem & break it up
- Team approach "Many hands make light work"

#### Requires

- A method for scheduling tasks
- A communication plan to maximise efficiency
- A distribution method for exchange of goods

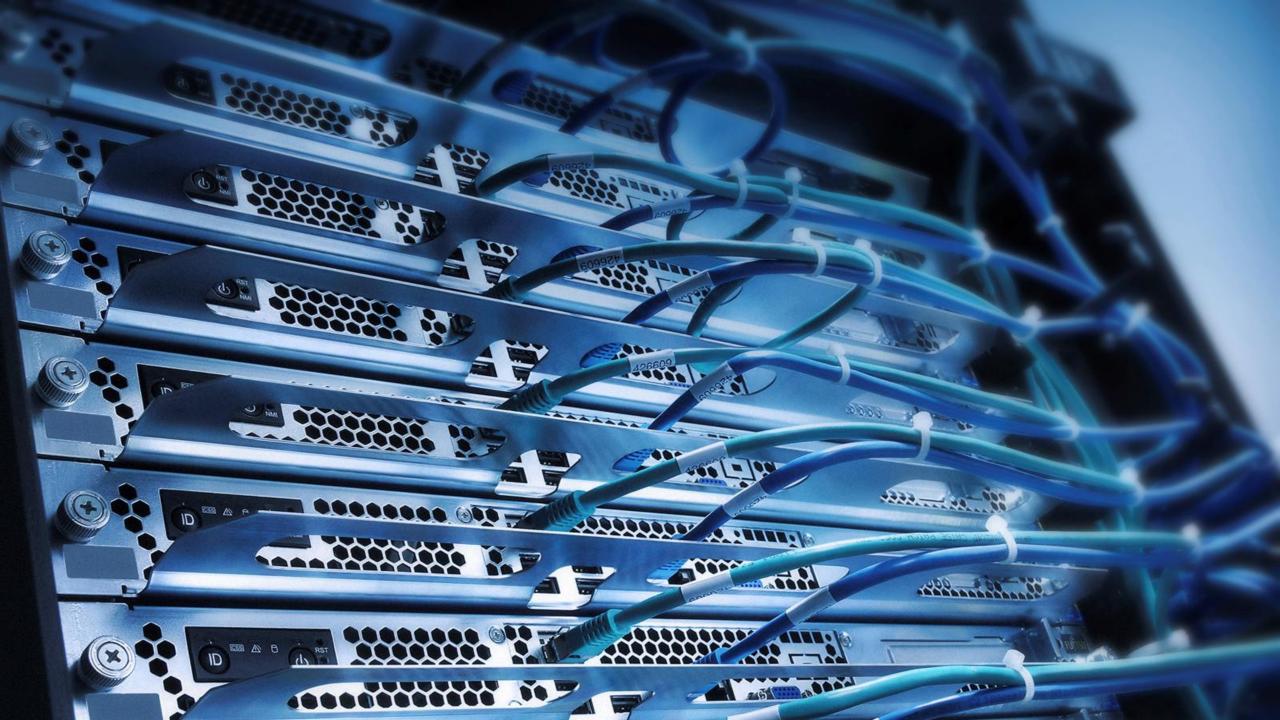
### SCALE UP VS OUT

#### UP

- Diminishing returns
- Non-linear costs at scale
- Parallel execution hard
- Low-mid complexity
- High concurrency
- Shared everything

#### OUT

- Linear scale (6PB+)
- Incremental cost
- Parallel execution by default
- Complex queries
- Medium concurrency
- Shared nothing



### Elements of MPP Database

### Concepts

- Logical layer
- Physical layer
- Distributed query engine
- Orchestration
- Data movement
- Lots of machines!

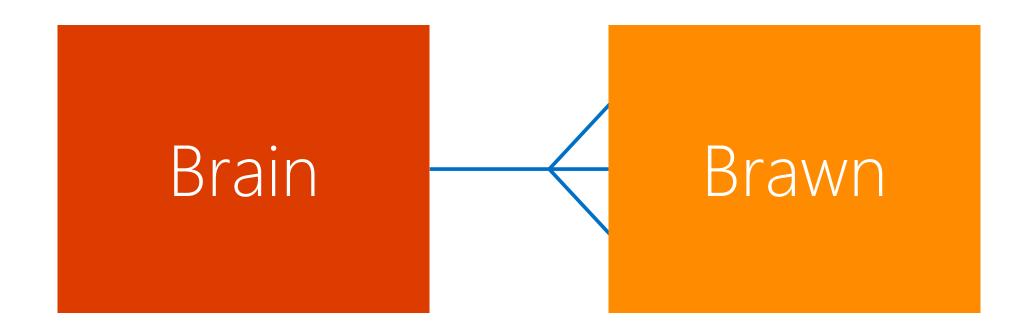
# Logical Layer

- Holds application metadata
- Does not persist application data
- Receives intermediate results
- Performs final aggregation

# Physical Layer

- Persists application data
- Performs queries as instructed

# Logical vs Physical



### Brain vs. Brawn



Brawn



 Brawn



Brawn



0110101010101010101 · 0101011101010101010 11010010

Brawn

11010010



Brawn



Brawn



### Brain

- Accepts requests from user
- Interprets requests for scale out
- Optimises requests
- Orchestrates actions / steps
- Final computation
- Returns result
  - > Runs SQL Server
  - > Stores metadata
  - > Performs final computation

One brain

Requires distributed query engine

### Brawn

Performs the heavy lift

Accepts requests from brain

Is a highly tuned SMP System

• Optimises requests from brain

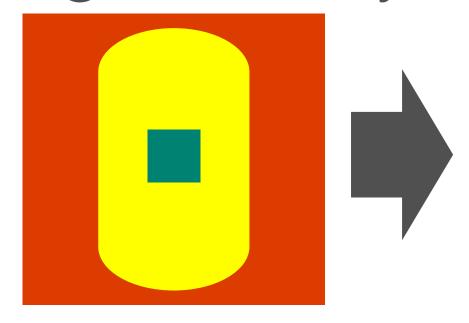
Executes query against the data

Lots of brawn

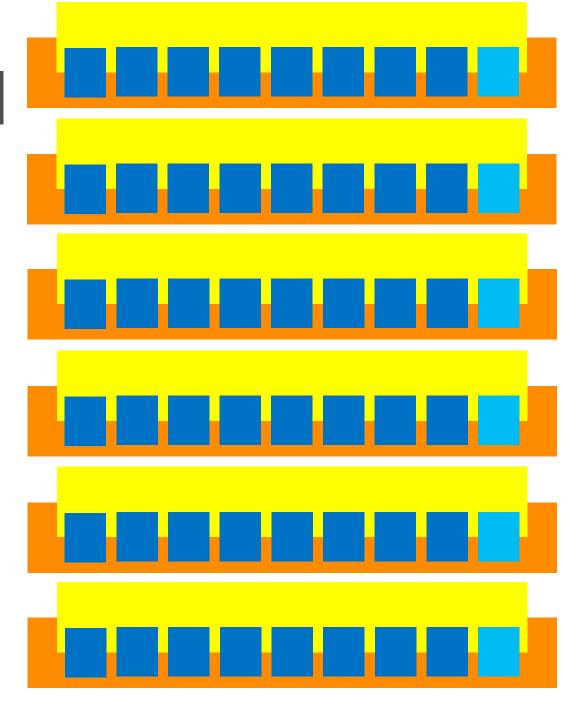
Uses SQL Server

No direct user interaction

# Logical vs Physical



- Metadata
- Distributed data
- Replicated data



# Replicating Data

# Data Replication Concepts

Defined:

"The process of repeating, duplicating or reproducing..."

# Why do we replicate data?

Primarily one of two reasons

- Enhanced availability
- Increased (read) performance

## What is the cost of replicating data?

Slower Writes!

Instead of writing data once you write it **n** times

- PDW region: **n** = number of compute nodes in your appliance
- Hadoop: **n** = replication factor set in Hadoop (default is 3 times)
- HDInsight: **n** = default is 2 or 3 depending on size of Hadoop region

### Data Replication in PDW

- Table Level
- Whole table copied to every Compute node
- Writes synchronised with distributed transactions
- Read optimisation
- Not used for availability
- Facilitates joins to distributed data
- Tends to be smaller, read-heavy tables such as dimensions

## Data Replication in Hadoop

- Affects all tables
- Availability & performance

Default replication factor is 3

- 1 data node with the data
- 1 data node locally (same switch)
- 1 data node remotely (different switch)

# Distributing Data

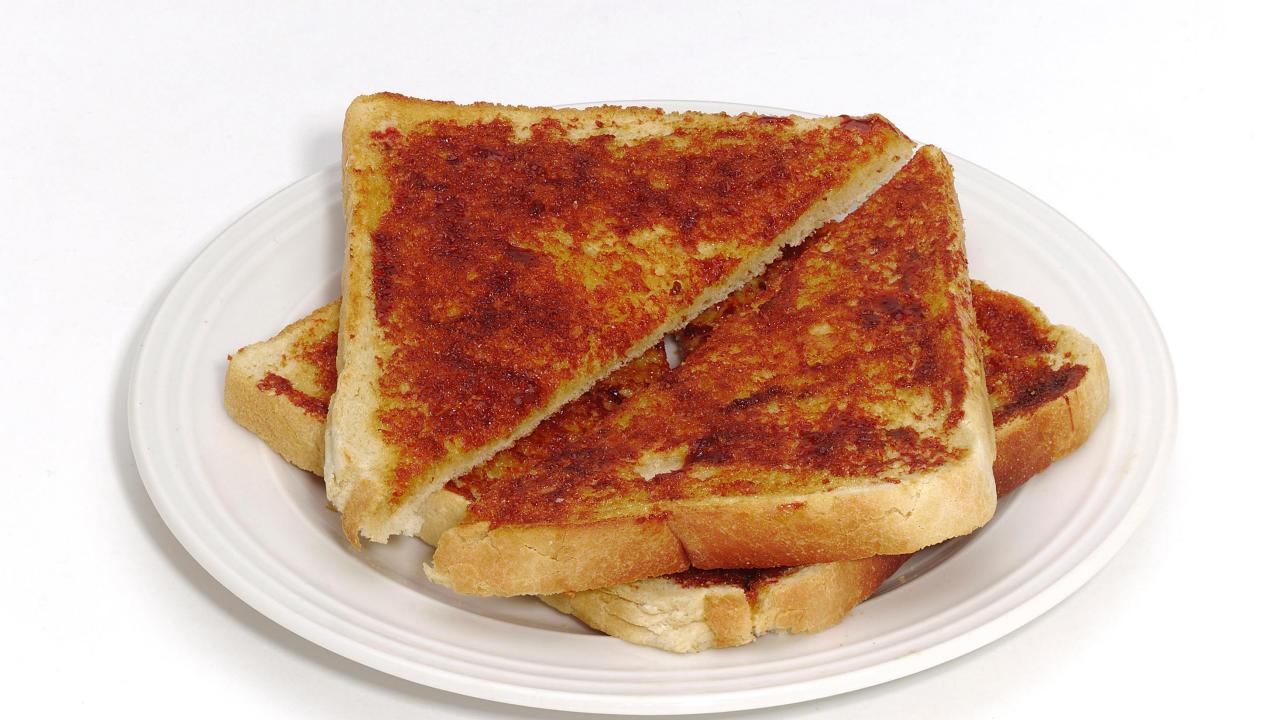
## Why Distribute Data

Divide and conquer – lots of small queries to solve

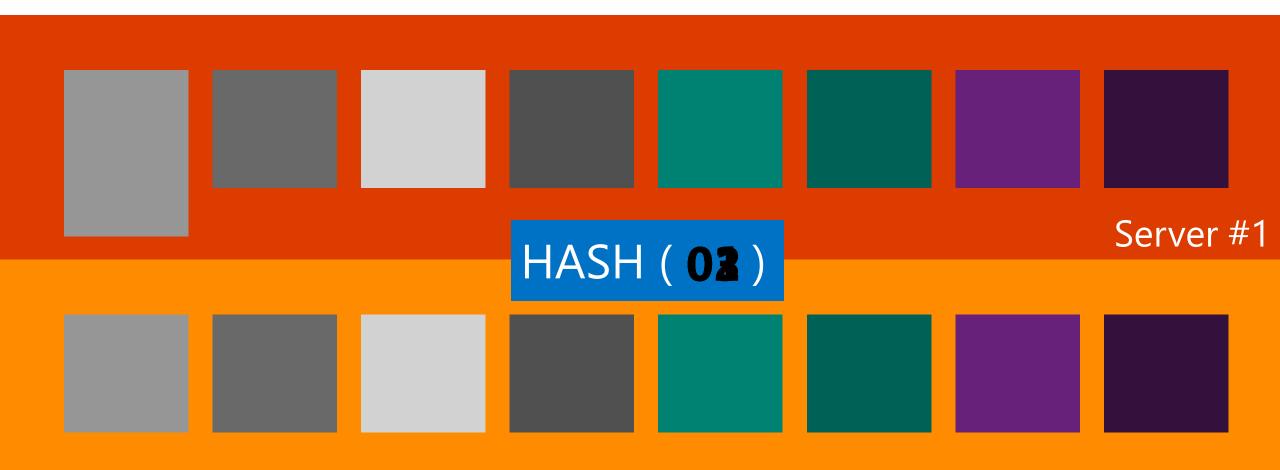
• Evenly spreading the data leads to even use of the

appliance resources





### How Data Gets Distributed



### What Data do we Distribute?

#### PDW

- Tends to be larger fact tables
- Can also be write-heavy tables (log tables)

#### HDInsight

- All data is distributed across the HDFS file system
- All data is also replicated

### Data Distribution

- Table level
- Data spread across all PDW Compute nodes
- Hash function calculates each row location
- DMS moves each row to correct location
- Data is held and written once, hardware provides availability

### Understanding Distributions

- Each distributed data location = a bucket of data
- Each bucket is called a distribution
- Each distribution:
  - maps to a physical table
  - allocated physical space
  - contains all rows that have the same distribution value
- 8 distributions on every compute node (A-H)
- Hash based on byte "padded" not actual value

## PDW Distributed Table Theory

### Recap

PDW holds data in one of two ways:

- Distributed
- Replicated

### When distributed

- Data is distributed across the entire cluster
- A hashing function is used to spread the data
- Hash created during either Insert or Load
- Hash performed by DMS not SQL Server
- Hash is based on a single column in a table
- Column chosen for hash is not updateable

## When Replicated

- DMS copies data to each compute node
- No hashing is required

### Distribution Basics

Distributed tables are split in two directions

- Vertically across compute nodes
- Horizontally within the compute node
- Each Horizontal split is called a distribution
- # Distributions = # compute nodes \* 8

Distribution Matrix

|            | Α | В | C | D | Ε | F | G | Н | EPL | DO_ | PRI |
|------------|---|---|---|---|---|---|---|---|-----|-----|-----|
| Compute 01 |   |   |   |   |   |   |   |   |     |     |     |
| Compute 02 |   |   |   |   |   |   |   |   |     |     |     |
| Compute 03 |   |   |   |   |   |   |   |   |     |     |     |
| Compute 04 |   |   |   |   |   |   |   |   |     |     |     |
| Compute 05 |   |   |   |   |   |   |   |   |     |     |     |
| Compute 06 |   |   |   |   |   |   |   |   |     |     |     |
|            |   |   |   |   |   |   |   |   |     |     |     |

10 as INT

|            | Α | В | C | D | Ε  | F | G | Н | EPL | -0G | PRI |
|------------|---|---|---|---|----|---|---|---|-----|-----|-----|
| Compute 01 |   |   |   |   |    |   |   |   |     |     |     |
| Compute 02 |   |   |   |   |    |   |   |   |     |     |     |
| Compute 03 |   |   |   |   | 10 |   |   |   |     |     |     |
| Compute 04 |   |   |   |   |    |   |   |   |     |     |     |
| Compute 05 |   |   |   |   |    |   |   |   |     |     |     |
| Compute 06 |   |   |   |   |    |   |   |   |     |     |     |
|            |   |   |   |   |    |   |   |   |     |     |     |

10 as BIGINT

|            | Α | В | C | D | Ε  | F | G | Н  | (EPL | _0G | PRI |
|------------|---|---|---|---|----|---|---|----|------|-----|-----|
| Compute 01 |   |   |   |   |    |   |   |    |      |     |     |
| Compute 02 |   |   |   |   |    |   |   |    |      |     |     |
| Compute 03 |   |   |   |   | 10 |   |   |    |      |     |     |
| Compute 04 |   |   |   |   |    |   |   |    |      |     |     |
| Compute 05 |   |   |   |   |    |   |   |    |      |     |     |
| Compute 06 |   |   |   |   |    |   |   | 10 |      |     |     |
|            |   |   |   |   |    |   |   |    |      |     |     |

72 as INT

|            | Α | В | C | D | Ε            | F | G | Н | REPL | -0G | PRI |
|------------|---|---|---|---|--------------|---|---|---|------|-----|-----|
| Compute 01 |   |   |   |   |              |   |   |   |      |     |     |
| Compute 02 |   |   |   |   |              |   |   |   |      |     |     |
| Compute 03 |   |   |   |   | 7 <u>5</u> 0 |   |   |   |      |     |     |
| Compute 04 |   |   |   |   |              |   |   |   |      |     |     |
| Compute 05 |   |   |   |   |              |   |   |   |      |     |     |
| Compute 06 |   |   |   |   |              |   |   |   |      |     |     |
|            |   |   |   |   |              |   |   |   |      |     |     |

What about NULL?

|            | Α    | В | C | D | Ε  | F | G | Н  | (EPL | DO_ | PRI |
|------------|------|---|---|---|----|---|---|----|------|-----|-----|
| Compute 01 | NULL |   |   |   |    |   |   |    |      |     |     |
| Compute 02 |      |   |   |   |    |   |   |    |      |     |     |
| Compute 03 |      |   |   |   | 10 |   |   |    |      |     |     |
| Compute 04 |      |   |   |   |    |   |   |    |      |     |     |
| Compute 05 |      |   |   |   |    |   |   |    |      |     |     |
| Compute 06 |      |   |   |   |    |   |   | 10 |      |     |     |
|            |      |   |   |   |    |   |   |    |      |     |     |

### Distribution Rule Summary

- 1. Hash on padded data type
- 2. Hash is not based on actual value
- 3. Hash is performed on a single column
- 4. All rows with the same padded value end up in the same distribution
- 5. "NULL" will always go to Distribution 1A
- 6. A distribution hold rows for > 1 hashed value

### Consequences of Distribution Theory

The hash is consistent across all tables

- Great for joining tables together
- Must have the same data type

Rationalise your data types!

### Consequences of Distribution Theory

Distribution key is not updateable!

Pick a distribution column that:

- Is static
- Does not need inferred members (-1)
- Does not contain NULL

Changing distribution key = Re-create the table!

## Locality & Orchestration

## Understanding Locality

- MPP systems distribute the data across servers
- Good for scalability
- Introduces overheads
- Data is not all in the same place!
- First we may need to move the data then process it

### Local vs Global Operations

#### Local operation

- Occurs on one or more Compute nodes
- Operates on a subset of the data
   Global operation
- Occurs on the Control node
- Operates on the set of data

### Location, Location, Location

Data is considered to be local (co-located) when

- No data movement is required to resolve a query
- All data is present on a given node to process the query

### Example – Sales Table

- Distributed by item
- Sales for an item are held in one distribution
- Sales for a store are in all distributions
- Joining by store \*may\* require movement
- Grouping by store \*may\* require movement

## Sales Table – Distributed by Item

Sales Item 1 Cust 1..N Store 1..N Sales Item 2 Cust 1..N Store 1..N Sales
Item 3
Cust 1..N
Store 1..N

Sales Item 4 Cust 1..N Store 1..N Sales Item 5 Cust 1..N Store 1..N

Sales Item 6 Cust 1..N Store 1..N

Sales Item 7 Cust 1..N Store 1..N Sales Item 8 Cust 1..N Store 1..N

|Server<u>#1</u>

Sales Item 9 Cust 1..N Store 1..N Sales Item 10 Cust 1..N Store 1..N Sales Item 11 Cust 1..N Store 1..N Sales Item 12 Cust 1..N Store 1..N Sales Item 13 Cust 1..N Store 1..N

Sales Item 14 Cust 1..N Store 1..N

Sales Item 15 Cust 1..N Store 1..N Sales Item 16 Cust 1..N Store 1..N

## Sales Table – Distributed by Store

Sales Store 1 Cust 1..N Item 1..N Sales Store 2 Cust 1..N Item 1..N

Sales Store 3 Cust 1..N Item 1..N Sales Store 4 Cust 1..N Item 1..N Sales Store 5 Cust 1..N Item 1..N Sales Store 6 Cust 1..N Item 1..N

Sales Store 7 Cust 1..N Item 1..N Sales Store 8 Cust 1..N Item 1..N

|Server#1

Sales Store 9 Cust 1..N Item 1..N Sales Store 10 Cust 1..N Item 1..N Sales Store 11 Cust 1..N Item 1..N

Sales Store 12 Cust 1..N Item 1..N Sales Store 13 Cust 1..N Item 1..N

Sales Store 14 Cust 1..N Item 1..N

Sales Store 15 Cust 1..N Item 1..N Sales Store 16 Cust 1..N Item 1..N

#### Data Location

When data is distributed PDW:

- Knows which column the data is distributed on
- Does not know which distribution contains the value x
- Queries all distributions

### Orchestration

- PDW take in a request from a user
- Breaks the request down into series of steps
- Steps can have parallel operations
- Serially iterates over the steps
- Manages return of answer back to user

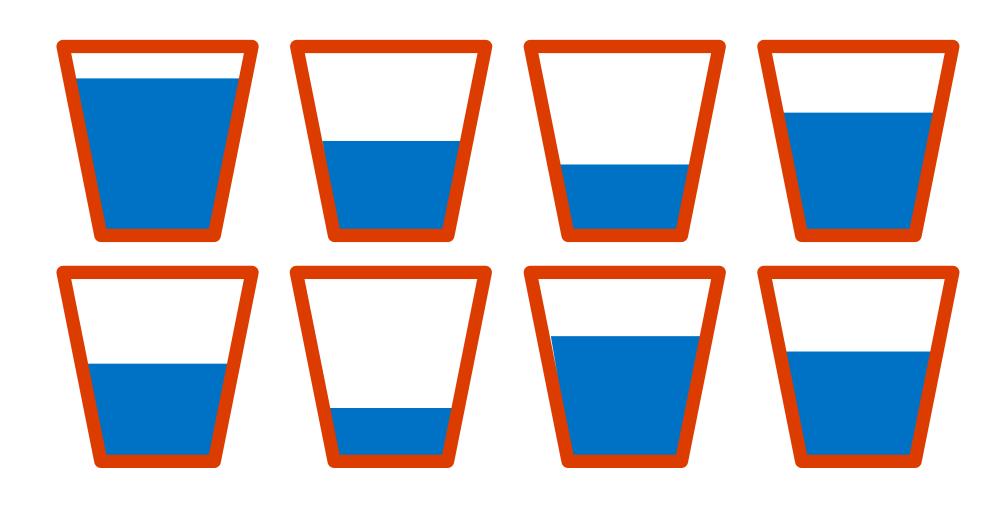
Orchestration steps happen in series Operations within step occur in parallel

### Orchestration Example

- 1. Generate random name for temp table
- 2. Generate temp table (using random name)
- 3. Move data into temp table
- 4. Execute query using temp table returning data to user
- 5. Perform clean-up

## Skew

### Distributed Data = Buckets of Water



### Know Your Enemy!

If MPP is the analytics superhero...

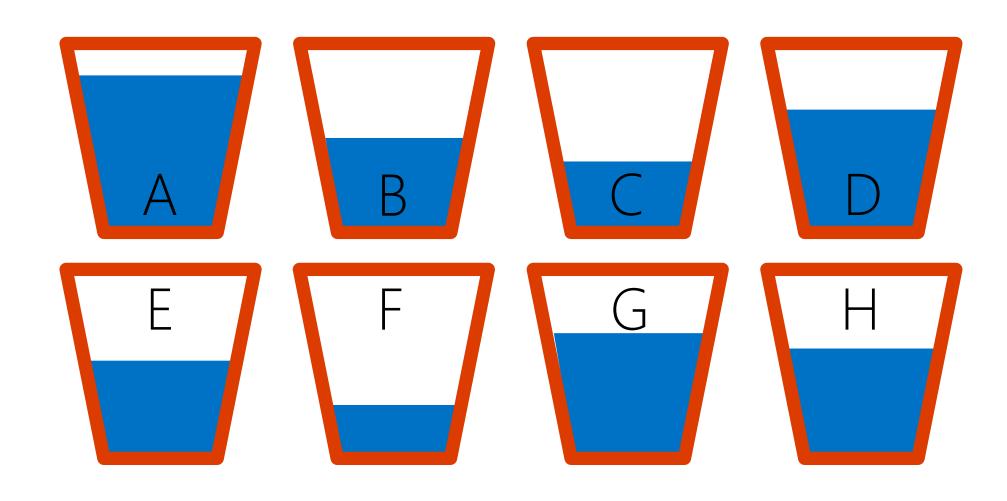
...then "Data Skew" is the evil arch enemy

Performance

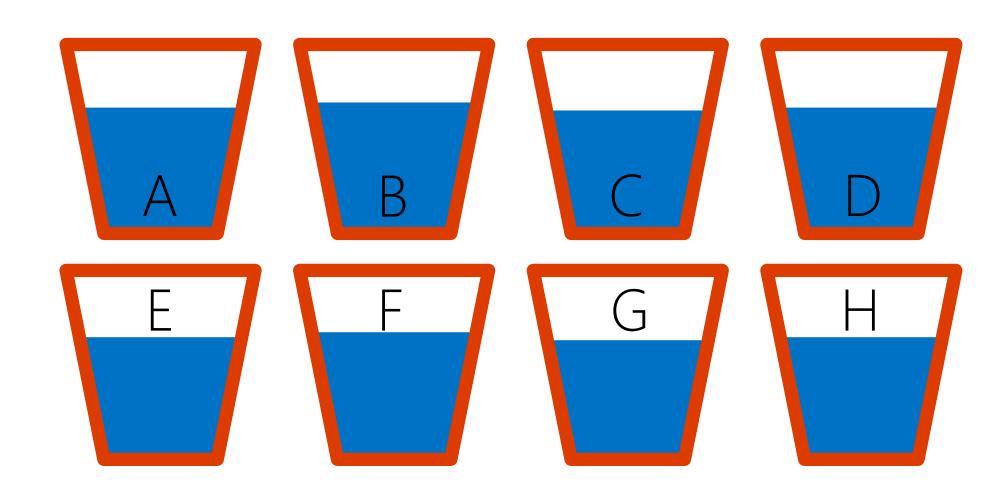
Storage



## If this was a drinking race who wins?



#### What about now?

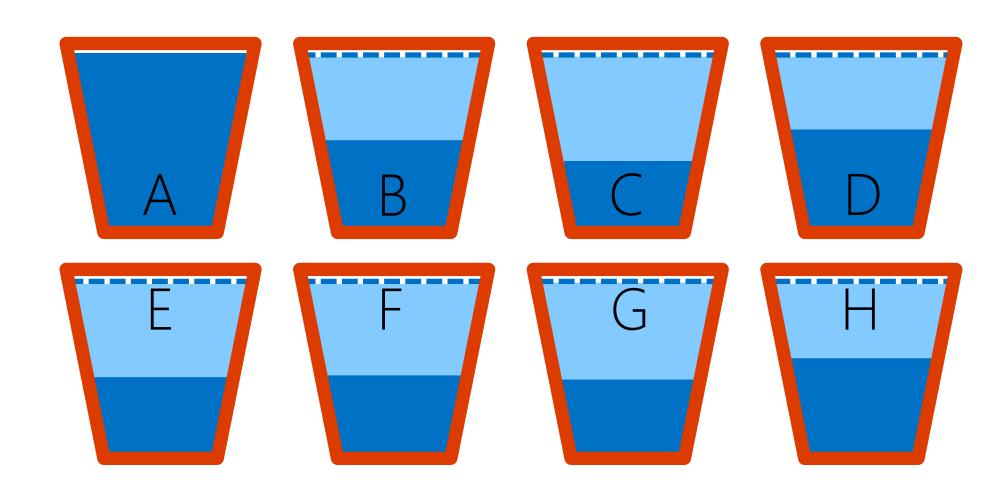


## Performance Impact of Skew

When the data is skewed...

- Some queries finish very quickly
- Others take disproportionately longer
- The user query is only complete when <u>all</u> queries have finished

## Storage & Skew



## Impact of Skew on Storage

- When one bucket is full all buckets are full
- Skewed data leads to accelerated consumption of storage capacity
- Available storage therefore is a logical concept
- Calculated as
  - MAX(storage used by bucket) \* # of buckets

## Parallelism



## How do we get parallelism?

- Via distributed tables
- Each distribution can be queried in parallel

#### Partial Parallelism

- Performed in parallel across compute nodes
- Performed in series across the distributions
- Guarantees transactional behaviour
- Examples:
  - INSERT
  - UPDATE
  - DELETE

## Partial parallelism in action



Server #2

#### Full Parallelism

- Performed in parallel across compute nodes
- Performed in parallel across the distributions
- Used for
  - New object creation
  - Reading data from a distributed table
- Examples:
  - CTAS (Create Table As Select)
  - SELECT

#### Full Parallelism in action



Server #2

#### MINDOP

- Witnessed when querying distributed tables
- Each distribution is queried simultaneously
- Every compute node will receive 8 queries
- Distributed queries achieve MINDOP by default
- Sets MAXDOP to 4 for each Distribution

#### DOP – Min & Max Values

| # Compute<br>Nodes | # Distributions | MINDOP | MAXDOP<br>(Physical Query) | MAXDOP<br>( Logical Query) |
|--------------------|-----------------|--------|----------------------------|----------------------------|
| 2                  | 16              | 16     | 4                          | 64                         |
| 3                  | 24              | 24     | 4                          | 96                         |
| 4                  | 32              | 32     | 4                          | 128                        |
| 6                  | 48              | 48     | 4                          | 192                        |
| 8                  | 64              | 64     | 4                          | 256                        |
| 9                  | 72              | 72     | 4                          | 288                        |

# Being Agnostic

## Better Together

- APS offered via Multiple Hardware Vendors
  - Hewlett Packard
  - Dell
  - Quanta
- Open Hadoop integration
  - Operating System
  - Location
  - Hadoop Distribution
  - Hadoop Version

## Monitoring

- PDW exposes management data via DMVs
- Any monitoring platforms can be extended to poll for configuration or performance data from PDW
- Alternative is to use Management Packs for PDW Region and/or Hadoop Region

## Backups

- PDW generates database backup files to a windows file share
- Backup agents can be configured to archive these backups from disk to alternate libraries

## BI Tools & ISV Applications

- MSBI Tools Supported including Power BI
- Applications connect to PDW via
  - ADO.NET
  - Native Client (ODBC / OLEDB)
  - JDBC
- Data is transferred via TDS

