



# Real-Time Operational Analytics

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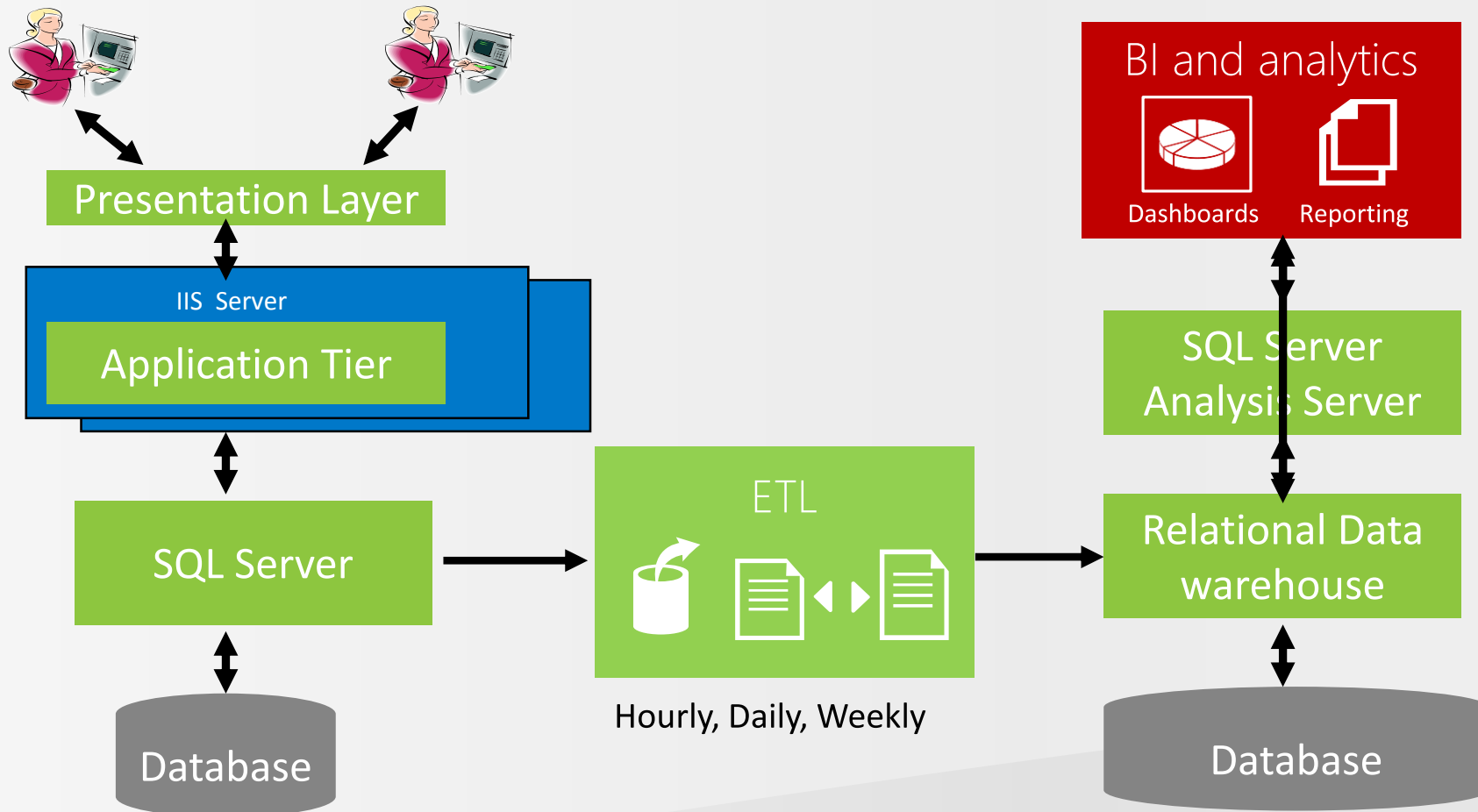
# Content

- Real-Time Operational Analytics an Introduction
- Column Store Indexes
- Real-Time Analytics on disk-based OLTP
- Real-Time Analytics on in-memory OLTP

## Demo

# Real-Time Operational Analytics

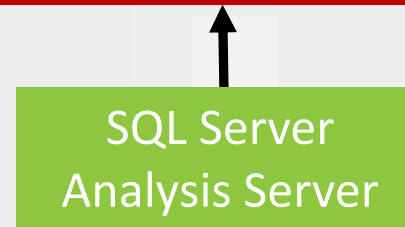
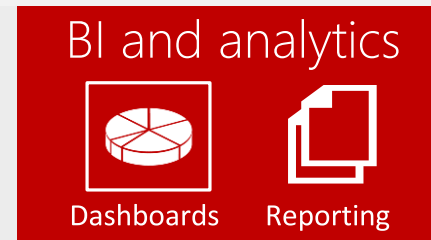
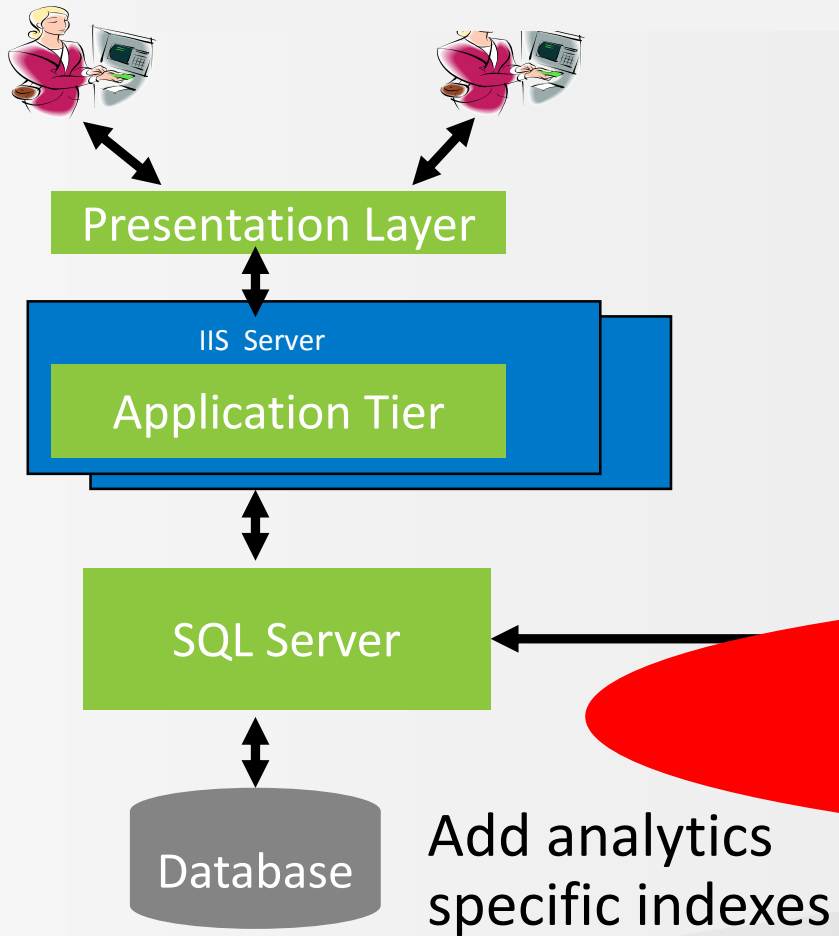
## Traditional BI/Analytics architecture



## Key Issues

- Complex implementation
- Requires two servers
- Data latency in analytics
- More businesses demand/require real-time analytics

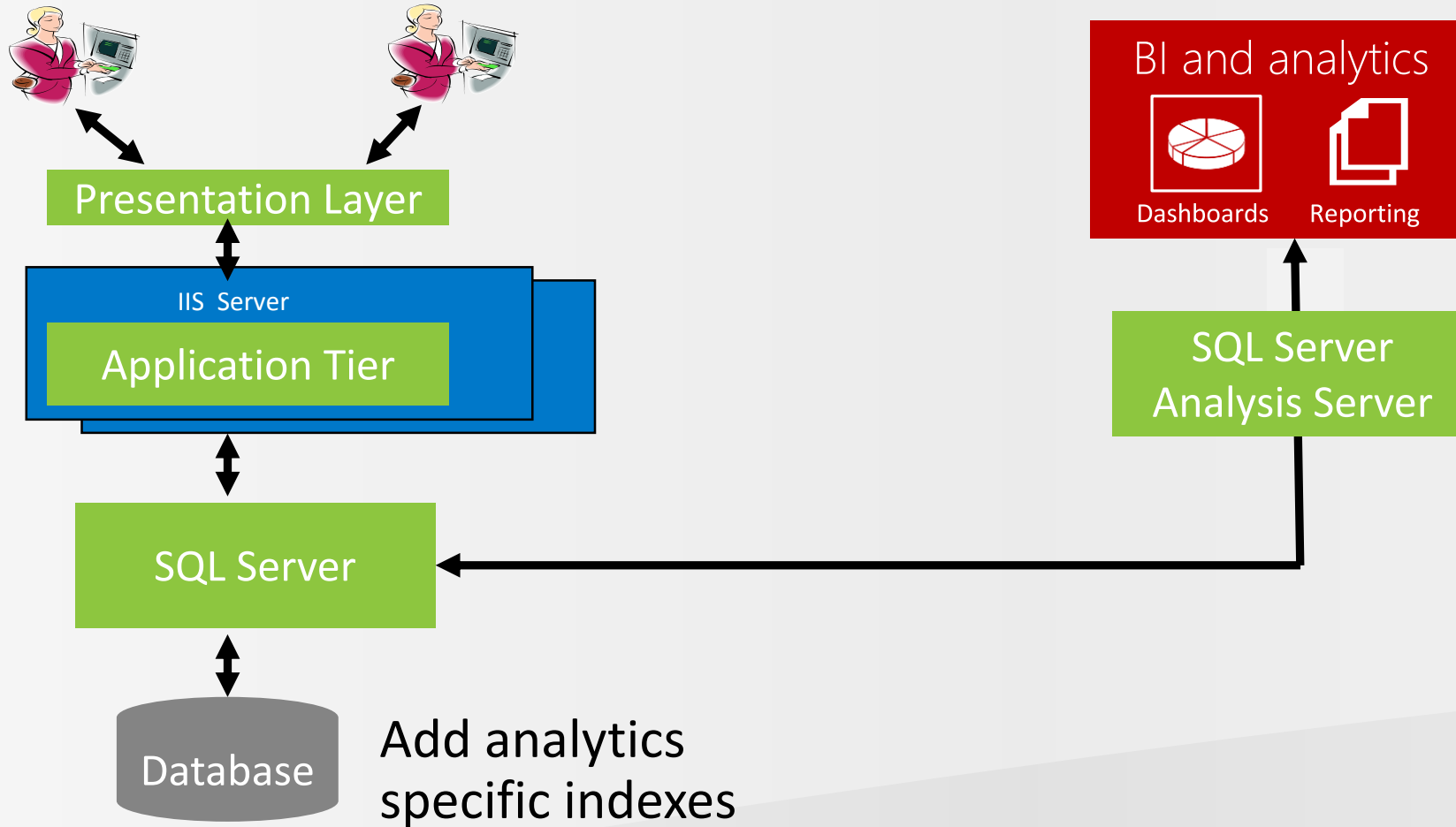
## Minimizing Data Latency for Analytics



## Benefits

- No Data Latency
- No ETL
- No separate Data Warehouse

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## Challenges

- Analytics queries are resource intensive and can cause blocking
- How to minimize impact on operational workload
- Sub-optimal execution of analytics on relational schema

## Goal

Performant analytics on operational schema  
Minimal impact on operational workload



Achieved using columnstore Index

## Operational Analytics

Ability to run analytics queries concurrently with operational workload using the same schema

### Not a replacement for:

- Extreme analytics queries performance possible using schemas customized (e.g. star/snowflake) and pre-aggregated cubes
- Data coming from non-relational sources
- Data coming from multiple relational sources requiring integrated analytic



# Column Store Indexes

Recap  
and enhancements

## Rowstore vs Columnstore

### Rowstore

Data stored in a sequence of rows

*Good for single row access,  
equality searches*

Page 1 of  
row store

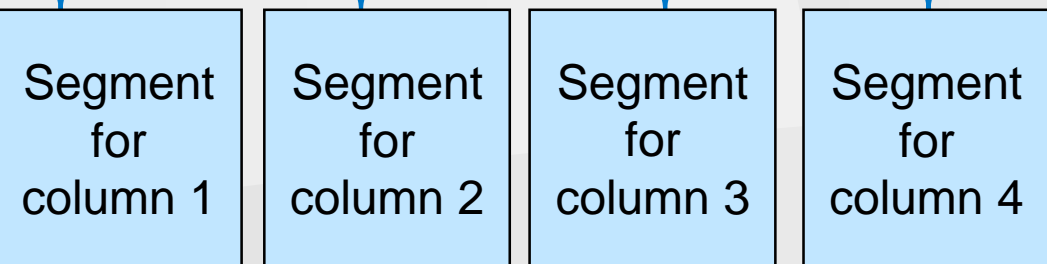
Page 2 of  
row store

Key	AlternateKey	Name	Stock
1	AR-5381	Adjustable Race	1000
2	BA-8327	Bearing Ball	1000
3	BE-2349	Ball Bearing Cage	800
4	BE-2908	Ball Bearing Grease	800
5	BL-2036	Blade	800
6	CA-5965	LL Crankarm	500
7	CA-6738	ML Crankarm	500

### Columnstore

Data stored in a sequence of columns

*Good for aggregate queries*



## Columnstore index features

### Improved compression

Data from same domain  
compress better

### Reduced I/O

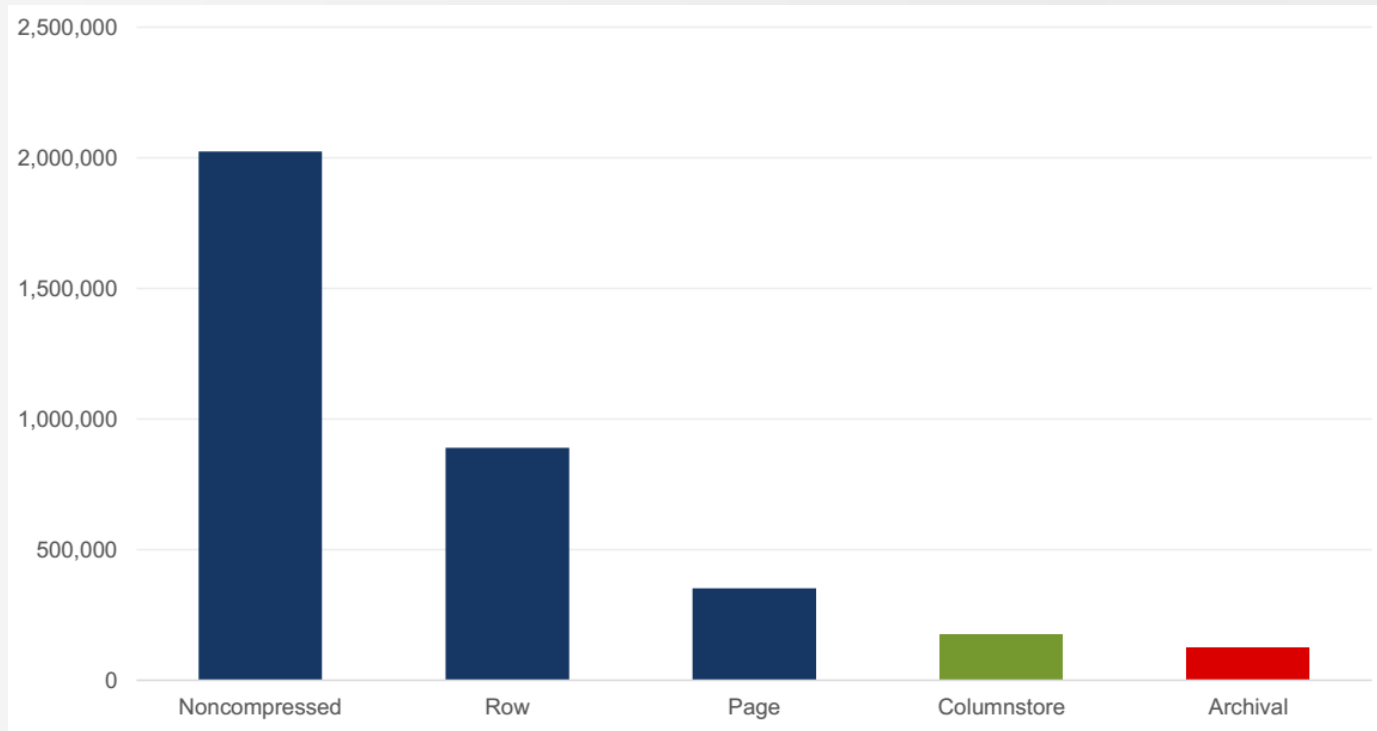
Fetch only columns needed

### Improved performance

More data fits in memory  
Optimized for CPU utilization

**Ideal for Data Warehouse workload**

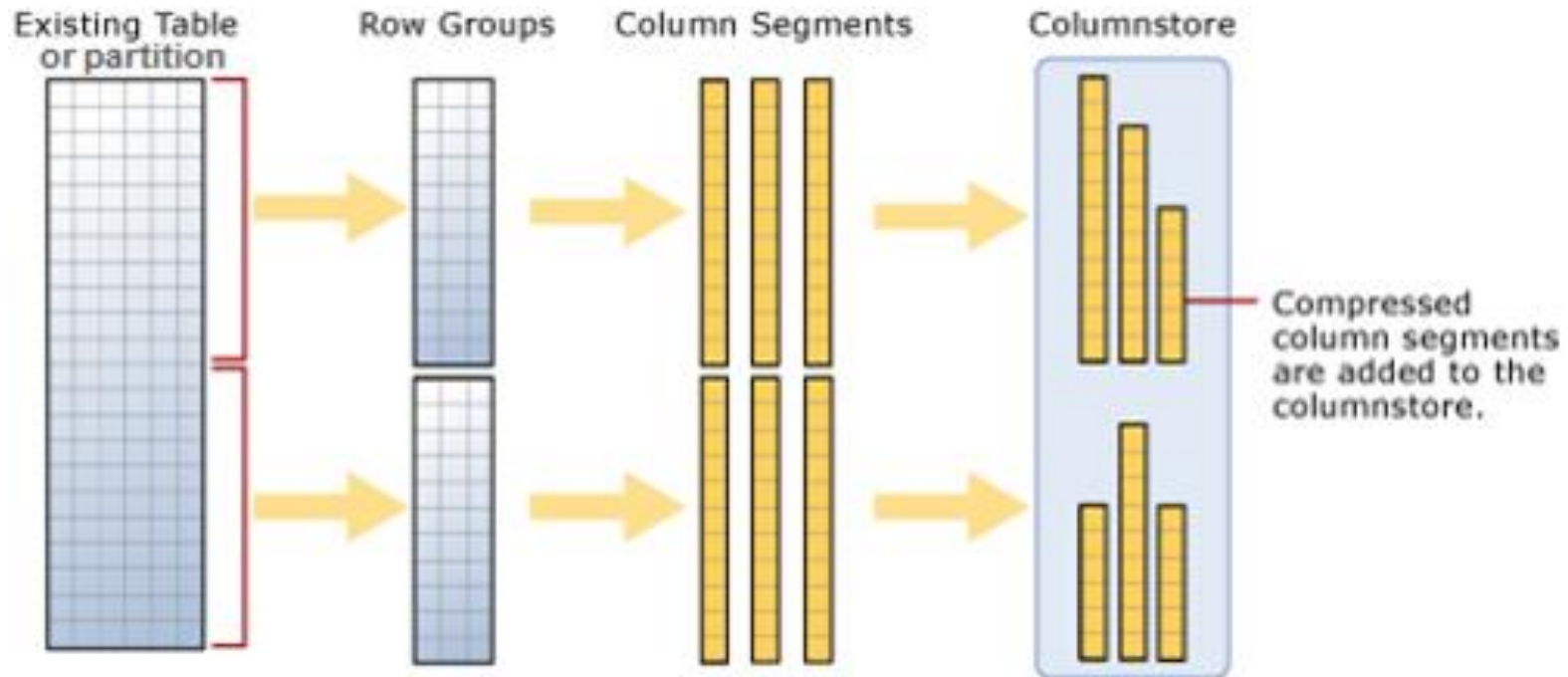
## Improved Compression



- Value Scale
- Bit-Array
- Run-length compression
- Dictionary encoding
- Huffman encoding
- Binary compression

## Columnstore index

rowgroups and columnsegments



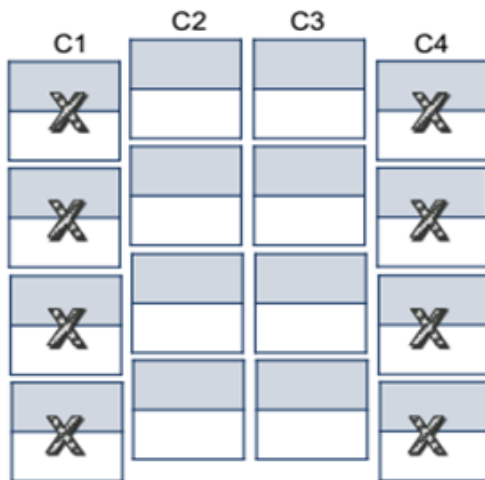
#rows per row group  
≤ 1,048,576 rows

One column segment for every column  
Each segment is compressed together

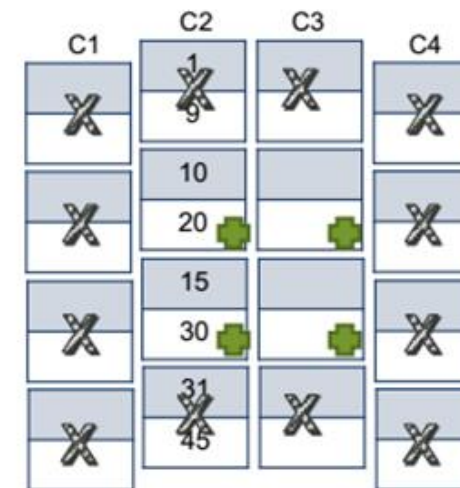
## Reading from a columnstore index

```
SELECT SUM(c2), SUM(c3)
FROM dbo.FactOnlineSales
WHERE c2 > 10 AND c2 <=20
```

Data stored column by column  
→ column elimination



Min and max value stored per rowgroup  
→ segment elimination



## Batch Execution

- allows the CPU to process approximately 1000 rows at a time
- Special CPU instructions (SIMD)
- Faster query processing, lower CPU utilization

Columnstore Index Scan (NonClustered)	
Scan a columnstore index, entirely or only a range.	
Physical Operation	Columnstore Index Scan
Logical Operation	Index Scan
Actual Execution Mode	Batch
Estimated Execution Mode	Batch
Storage	ColumnStore
Actual Number of Rows	247390208
Actual Number of Batches	581725
Estimated Operator Cost	14.1185 (8%)
Estimated I/O Cost	0.512014
Estimated CPU Cost	13.6065
Estimated Subtree Cost	14.1185
Number of Executions	2
Estimated Number of Executions	1
Estimated Number of Rows	247390000
Estimated Row Size	19 B
Actual Rebinds	0
Actual Rewinds	0
Ordered	False
Node ID	12
<b>Object</b>	
[AdventureWorksDW2012].[dbo].[FactInternetSalesBig].	
[csi_FactInternetSalesBig] [fis]	
<b>Output List</b>	
[AdventureWorksDW2012].[dbo].	
[FactInternetSalesBig].CustomerKey,	
[AdventureWorksDW2012].[dbo].	
[FactInternetSalesBig].SalesAmount	

## Columnstore indexes

	Clustered	Nonclustered
Disk Based	<ul style="list-style-type: none"><li>Primary storage (=data)</li></ul> <div>Nonclustered B-tree indexes can be added since 2016 !!</div>	<ul style="list-style-type: none"><li>Copy of data</li><li>Subset or all rows and columns</li></ul> <div>Updateable since 2016 !!</div>

- Share the same storage format
- Records are NOT sorted in either index !!

enables  
real-time  
operational  
Analytics !!

	Clustered	Nonclustered
Memory Based	<ul style="list-style-type: none"><li>Full copy of data (all columns all rows)</li></ul> <div>Since 2016 !!</div>	Not Available (yet)

enables  
real-time  
operational  
Analytics !!



# Real-Time Analytics on Disk-Based OLTP

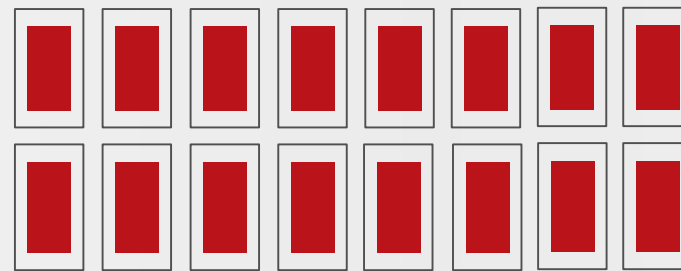
## SQL Server 2012 introduced **read-only nonclustered columnstore** indexes

### Usability

- Data warehouse

### Key Issues

- Redundancy
- Read-only



## SQL Server 2014 introduced **updateable clustered columnstore** indexes

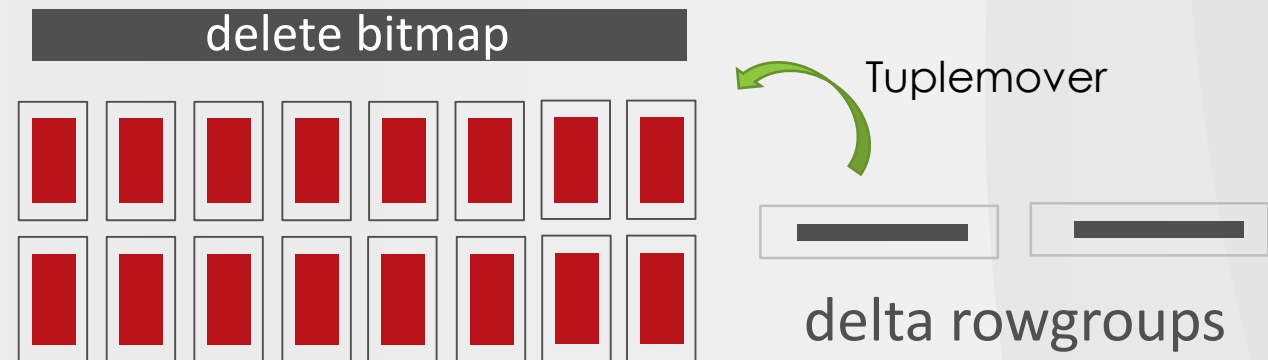
Implemented through delete bitmap and delta rowgroups

### Usability

- Data warehouse

### Key Issues

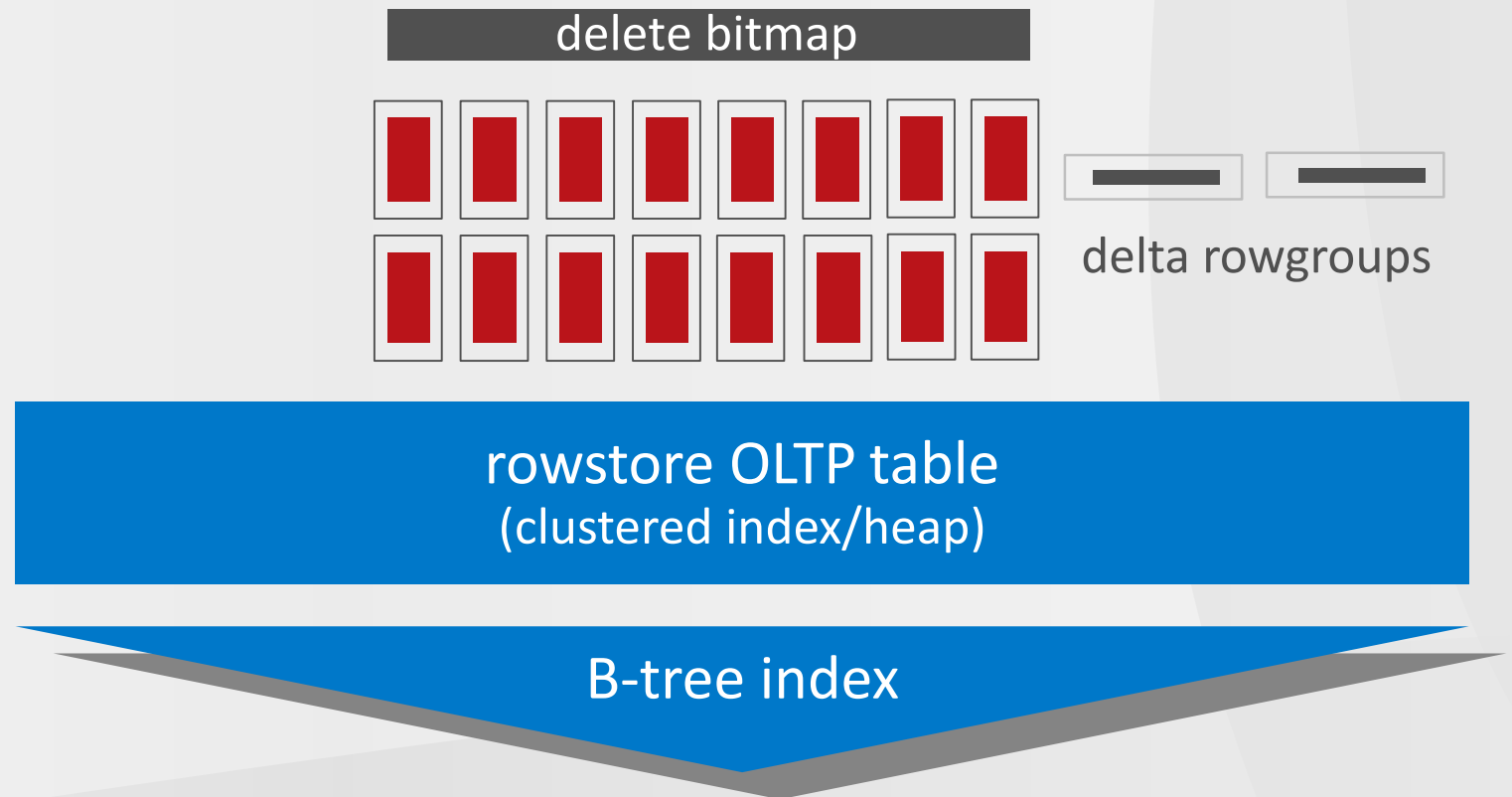
- No additional indexes
- No referential integrity
- Slow for trickle inserts



## SQL Server 2016 introduces **updateable nonclustered columnstore** indexes

### Usability

- Real-Time Operational Analytics

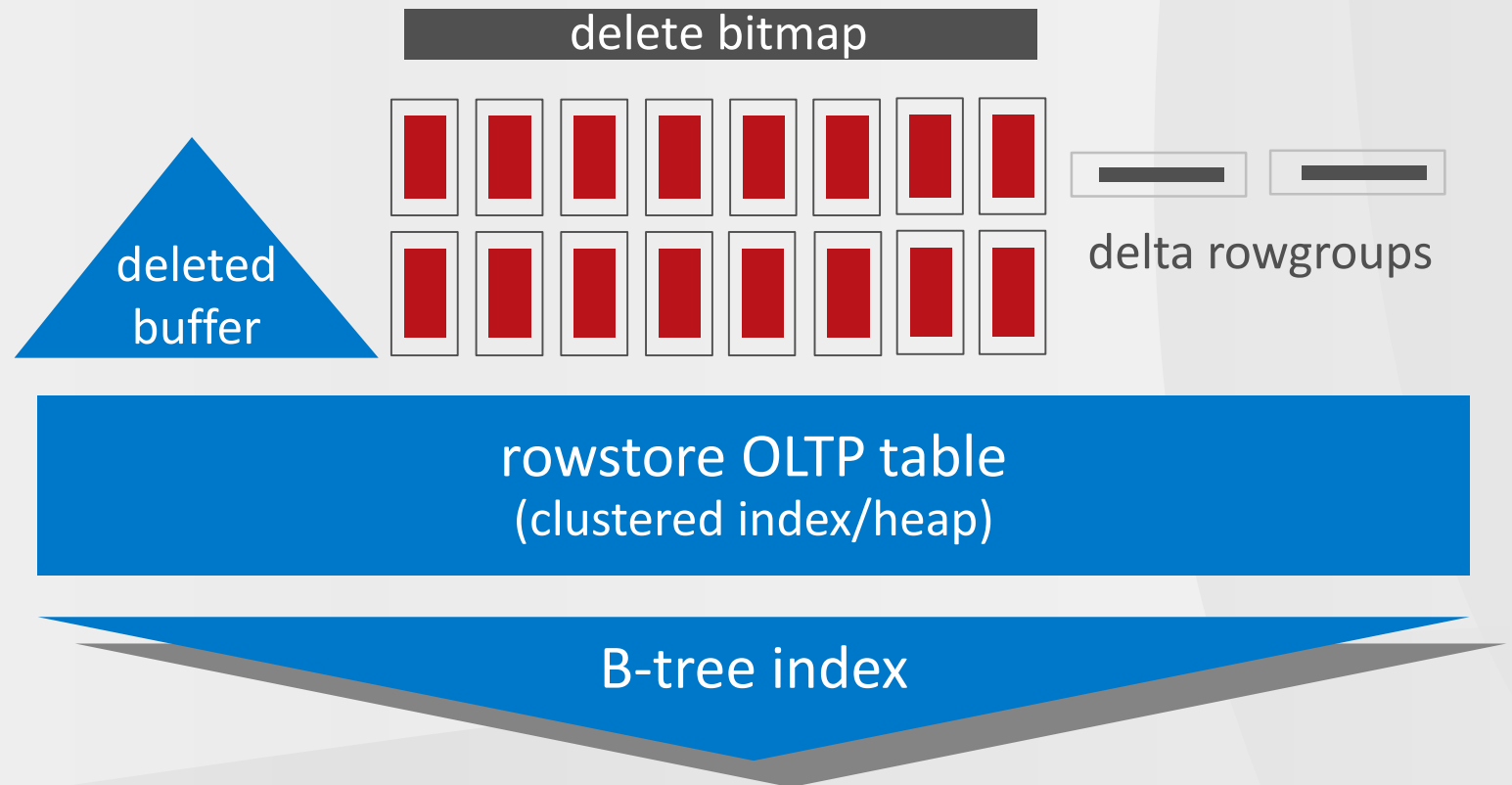


## SQL Server 2016 introduces **updateable nonclustered columnstore** indexes

Implemented through deleted buffer

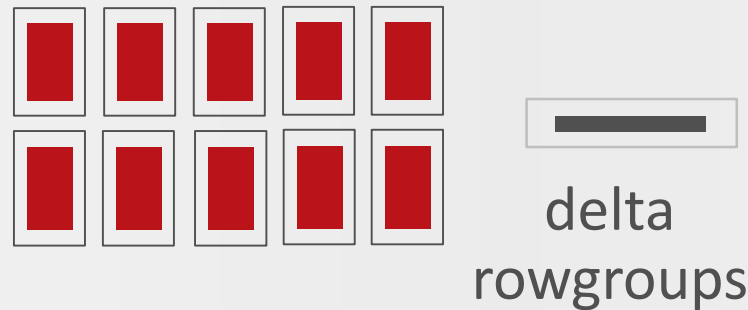
### Deleted buffer

- Contains references to the rows that are deleted/updated but are not yet copied into the deleted bitmap



## SQL Server 2016 – Filtered Index

- to index only cold data
- analytics queries access both column store and hot data transparently

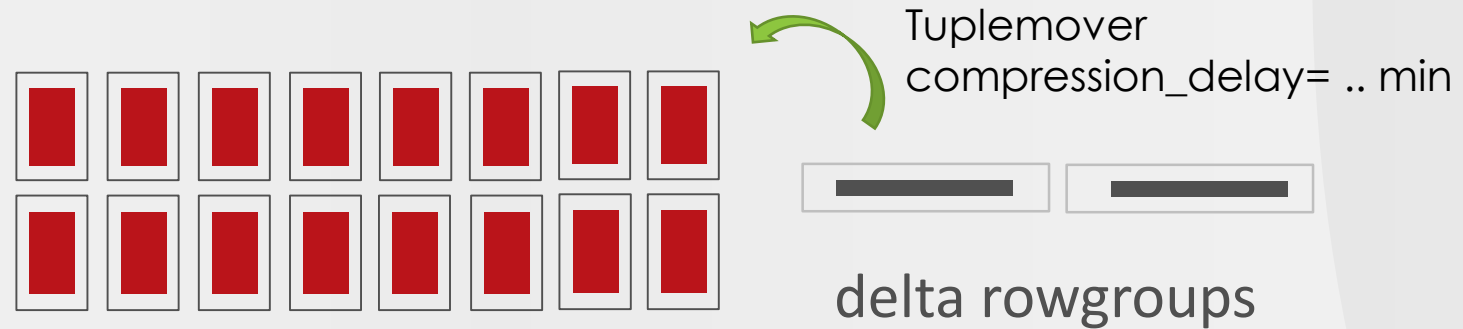


rowstore OLTP table  
(clustered index/heap)

hot data

## SQL Server 2016 – Compression Delay

- to delay data compression of the Delta-Stores (open and the closed ones)



rowstore OLTP table  
(clustered index/heap)

hot data

# Real-Time Analytics on In-Memory OLTP

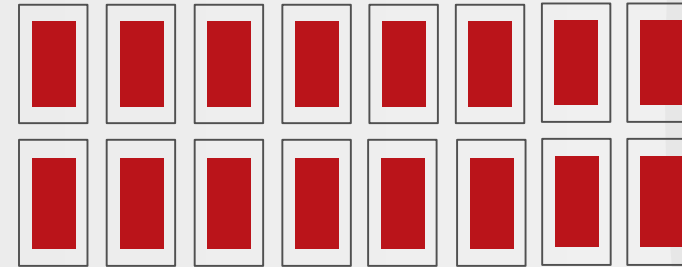


## SQL Server 2016 introduces **clustered columnstore** indexes on in-memory tables

### In-memory clustered columnstore index

- Full *copy* of data (all rows, all columns)
- Completely In-Memory

deleted rows table (DRT)



In-memory OLTP table  
(memory optimized table)

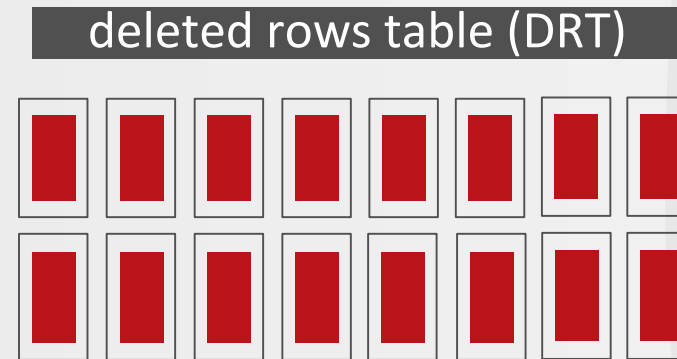
Tail  
hot data

hash and range indexes

## SQL Server 2016 introduces **clustered columnstore** indexes on in-memory tables

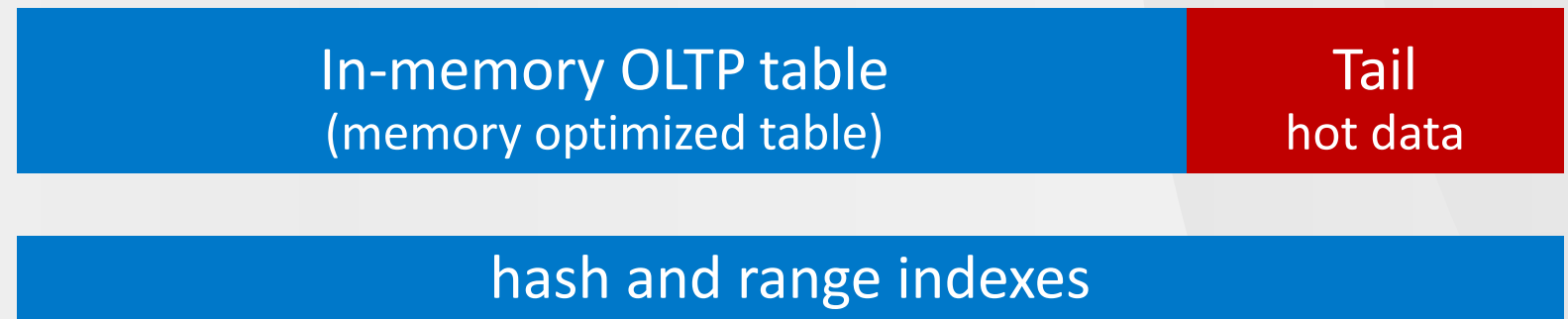
### Use of in-memory table tail instead of delta rowgroups

- Rows are moved if not modified in the past hour in chunks of  $\leq 1045678$  rows.
- Rows receive a *Columnstore RowId* when compressed (rowgroup and rowposition)
- Compression Delay can be used



### Deleted Rows Table

- Hash-based In-Memory table
- stores the *Columnstore RowId*'s of modified rows

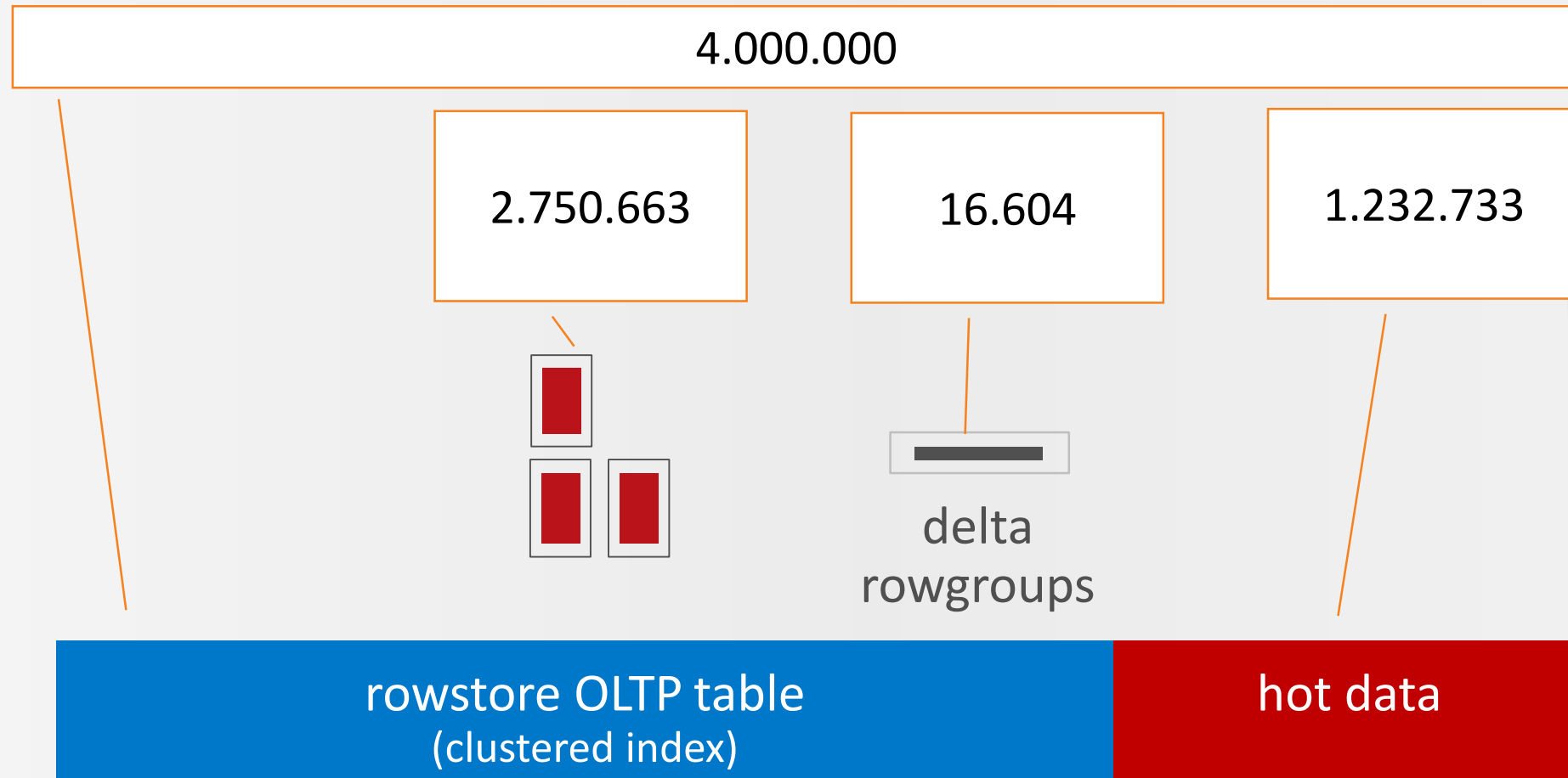


# Demo

## Scenario

- OLTP system: Order Management Application
- Table Order with account-key, customer name, order number, purchase price and status
- The table has 3 million records with order information
  
- Disk-based -> Create Nonclustered columnstore index
- In-memory -> Create Clustered columnstore index
- Load 1 million orders and these orders are not yet received by the customers.
- Run analytics queries

## Real-time OLTP | Disk-Based



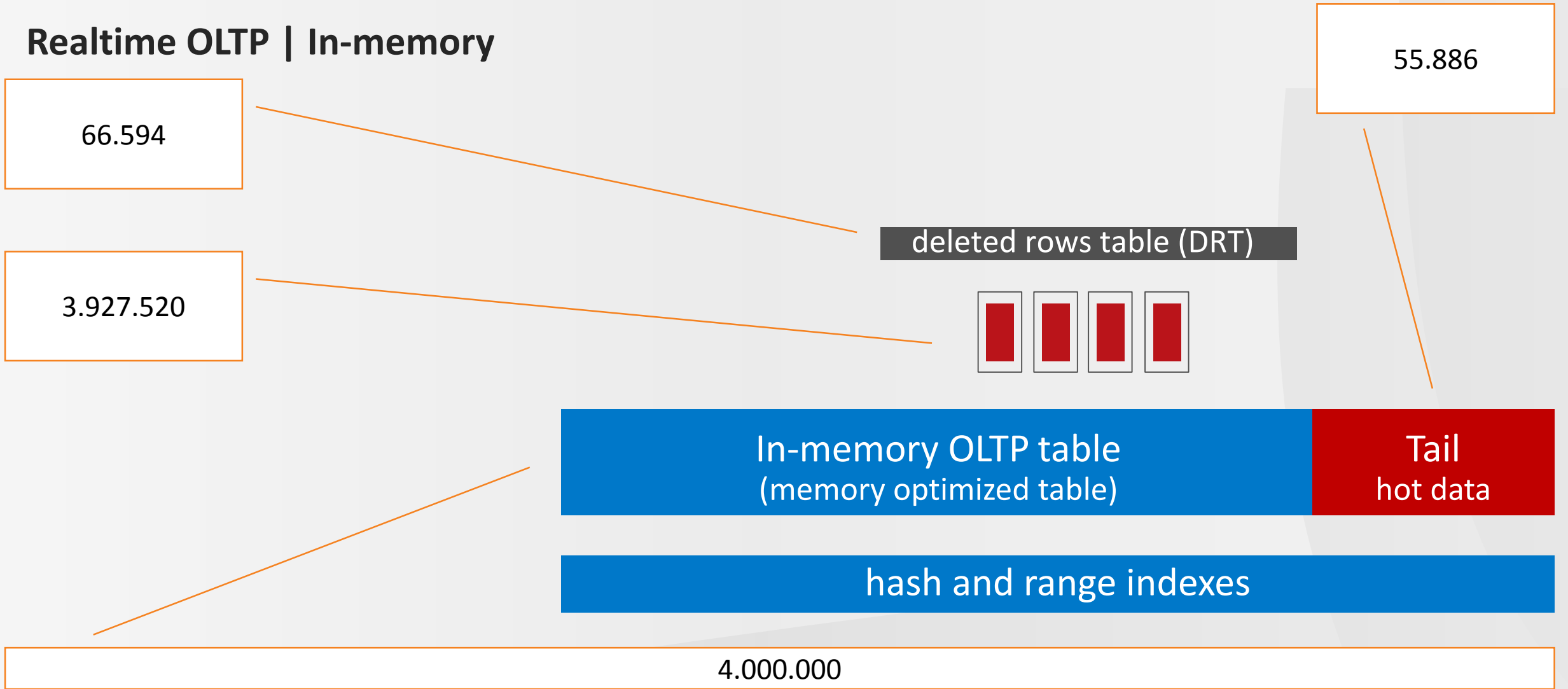
## Real-time OLTP | Disk-Based

SUM(PurchasePrice),  
MAX(PurchasePrice),  
AVG(PurchasePrice)

	Rowstore	NCCI	NCCI with filter
Execute time	800 ms	200 ms	50 ms
CPU time	1000 ms	150 ms	10 ms
Logical reads	42.000	30.000	0

Segments: 4

## Realtime OLTP | In-memory



## Real-time OLTP | In-memory (CCI) versus disk Based (NCCI)

```
SUM(PurchasePrice),  
MAX(PurchasePrice),  
AVG(PurchasePrice)
```

	In-memory	Disk based
Execute time	51 ms	71 ms
CPU time	0 ms	16 ms
Segment reads	6	4



## Data Solutions **Trainingen**

- |  |   |                           |
|--|---|---------------------------|
| ▪ SQL Server Performance Tuning and Optimization | ➔ | 24 augustus en 11 oktober |
| ▪ Updating Your Skills to SQL Server 2016        | ➔ | 28 september              |
| ▪ The Essentials of Programming in R             | ➔ | 22 augustus               |
| ▪ Microsoft Azure Machine Learning               | ➔ | 08 september              |
| ▪ Microsoft Azure Data Solutions                 | ➔ | 06 oktober                |
| ▪ Mastering and Optimizing DAX                   | ➔ | 17 oktober                |

**[training.infosupport.com](http://training.infosupport.com)**

## Further Reading

**Niko Neugebauer**

SQL Server, Columnstore, Data Platform & Community

**Kalen Delaney**

In-Memory OLTP

# Vragen?