







Advanced T-SQL Querying and Query Tuning

Itzik Ben-Gan
T-SQL Trainer
Lucient



Learning Pathway: Query Tuning

-  Identify Poorly Performing Queries - Three Tools You Already Own
 - Grant Fritchey / level 100 / Wednesday Nov 10, 15:15 UTC
-  Here's the Execution Plan ... Now What?
 - Hugo Kornelis / level 200 / Wednesday Nov 10, 16:45 UTC
-  Indexing for Performance
 - Kimberly Tripp / level 200 / Wednesday Nov 10, 21:15 UTC
-  Demystifying Statistics in SQL Server
 - Erin Stellato / Level 200 / Thursday Nov 11, 14:30 UTC
-  Query Tuning Tips Concerning Table Expressions
 - Itzik Ben-Gan / Level 300 / Thursday Nov 11, 16:45 UTC
-  Tackling Monster Stored Procs
 - Allen White / Level 200 / Thursday Nov 11, 19:00 UTC

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Agenda

- Search arguments
- Join ordering optimization
- Adaptive / Intelligent QP
 - Batch-mode processing and batch mode on rowstore
 - Adaptive joins
 - Interleaved execution and table variable deferred compilation
 - Scalar UDF inlining
 - Memory grant feedback
- APPLY
- Window functions
- OFFSET-FETCH



Search argument (SARG)

- SARG: filter predicate that enables the optimizer to rely on index order
 - No manipulation of filtered column (OK to manipulate other side)
 - Operator represents a consecutive range of keys
- Careful with NULLs!

```
-- Not SARG
SELECT orderid, shippeddate
FROM Sales.Orders
WHERE YEAR(shippeddate) = 2018;

-- SARG
SELECT orderid, shippeddate
FROM Sales.Orders
WHERE shippeddate >= '20180101'
AND shippeddate < '20190101';
```

```
-- SARG, incorrect
SELECT orderid, shippeddate FROM Sales.Orders
WHERE shippeddate = @dt;

-- Correct, not SARG
SELECT orderid, shippeddate FROM Sales.Orders
WHERE ISNULL(shippeddate, '99991231') = ISNULL(@dt, '99991231');

-- Correct, ugly SARG
SELECT orderid, shippeddate FROM Sales.Orders
WHERE shippeddate = @dt
OR (shippeddate IS NULL AND @dt IS NULL);

-- Correct, elegant SARG
SELECT orderid, shippeddate FROM Sales.Orders
WHERE EXISTS(SELECT shippeddate INTERSECT SELECT @dt);
```

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Join ordering optimization

- Joins are commutative ($A \Join B = B \Join A$) and associative ($(A \Join B) \Join C = A \Join (B \Join C)$)
- Optimizer explores candidate plans with different orders
 - Limited transformations with outer joins: $A \Join B = B \Join A$
 - More flexibility with inner and cross joins; theoretically $(2N - 2)! / (N - 1)!$ permutations
 - To reduce exploration space, certain layouts not considered by default, e.g., bushy
- Use FORCE ORDER query hint or SET FORCEPLAN option for troubleshooting

```
SELECT DISTINCT C.companyname AS customer,
S.companyname AS supplier
FROM Sales.Customers AS C
INNER JOIN Sales.Orders AS O
ON O.custid = C.custid
INNER JOIN Sales.OrderDetails AS OD
ON OD.orderid = O.orderid
INNER JOIN Production.Products AS P
ON P.productid = OD.productid
INNER JOIN Production.Suppliers AS S
ON S.supplierid = P.supplierid
OPTION (FORCE ORDER);
```

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Join ordering optimization

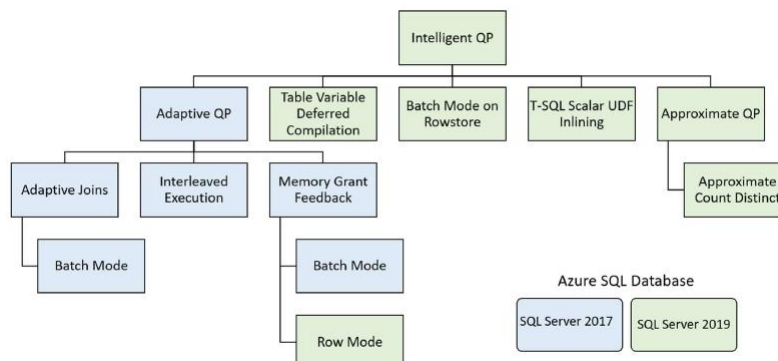
- ON-clause order defines logical join ordering (and physical w/FORCE ORDER)
- For query to be valid ON clause must appear below two units being joined

```
-- Join O with OD first, then C with result
-- Use as physical order
SELECT DISTINCT C.companyname AS customer,
S.companyname AS supplier
FROM Sales.Customers AS C
INNER JOIN
( Sales.Orders AS O
  INNER JOIN Sales.OrderDetails AS OD
    ON OD.orderid = O.orderid )
  ON O.custid = C.custid
INNER JOIN Production.Products AS P
  ON P.productid = OD.productid
INNER JOIN Production.Suppliers AS S
  ON S.supplierid = P.supplierid
OPTION (FORCE ORDER);
```

```
-- Include customers with no matches
SELECT DISTINCT C.companyname AS customer,
S.companyname AS supplier
FROM Sales.Customers AS C
LEFT OUTER JOIN
( Sales.Orders AS O
  INNER JOIN Sales.OrderDetails AS OD
    ON OD.orderid = O.orderid
  INNER JOIN Production.Products AS P
    ON P.productid = OD.productid
  INNER JOIN Production.Suppliers AS S
    ON S.supplierid = P.supplierid )
  ON O.custid = C.custid;
```

Adaptive / Intelligent QP

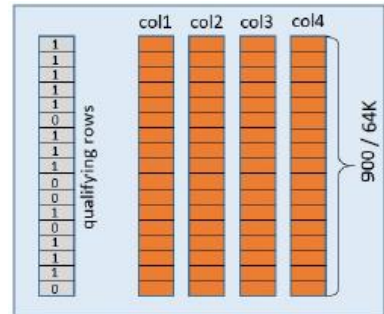
- SQL Server 2017 introduces adaptive query processing capabilities
- SQL Server 2019 enhances those to broader intelligent QP capabilities



Batch-mode processing and batch mode on rowstore

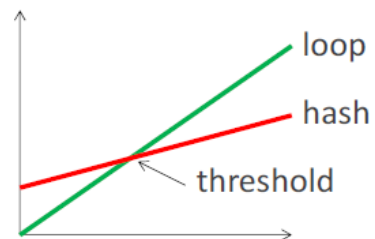
- Row mode: operator iterates once per row, metadata evaluated per row
- Batch mode: batch has vectorized representation of relevant columns, size 64KB/64-900 rows; operator iterates and evaluates metadata once per batch
- Considered automatically when columnstore indexes are present, even if not used
- Considered on rowstore starting with SQL Server 2019 Enterprise Edition under certain conditions (see queryprocessor.com/batch-mode-on-row-store)
- Backdoor: create dummy filtered columnstore index

```
CREATE NONCLUSTERED COLUMNSTORE INDEX idx_cs
ON dbo.Orders(orderid)
WHERE orderid = -1 AND orderid = -2;
```



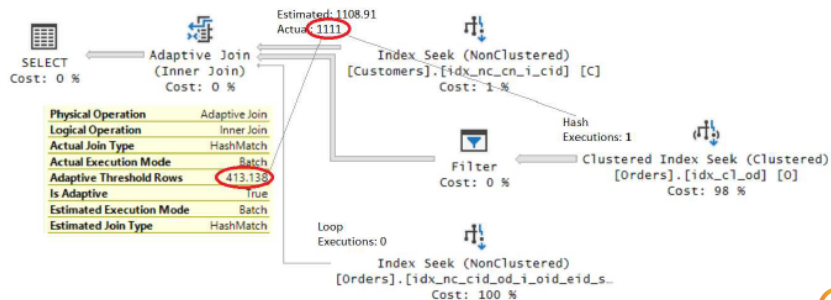
Adaptive joins

- Introduced in SQL Server 2017
- Supports both hash and loop joins, choice which to execute at run time based on threshold
- Same outer input
- One inner input for hash (middle branch)
- Another inner input for loop (bottom branch)
- \geq threshold – hash, $<$ threshold – loop
- Initially supported only in batch mode; can use dummy filtered columnstoreindex backdoor to enable



Adaptive joins

```
SELECT C.custid, C.custname,
       O.orderid, O.empid, O.shipperid, O.orderdate
FROM   dbo.Customers AS C
       INNER JOIN dbo.Orders AS O
         ON O.custid = C.custid
WHERE  C.custname LIKE @custprefix + N'%'
       AND O.orderdate BETWEEN @fromdate AND @todate;
```



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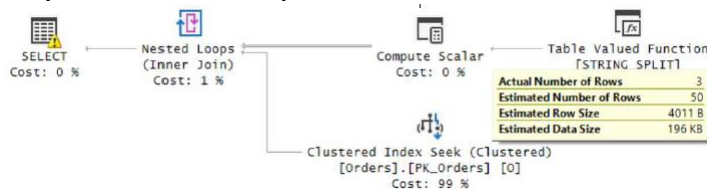
String splitting with the STRING_SPLIT function

- Introduced in SQL Server 2016

```
CREATE OR ALTER PROC dbo.GetOrders(@orderids AS VARCHAR(8000))
AS
SELECT O.orderid, O.orderdate, O.custid, O.empid
FROM Sales.Orders AS O
     INNER JOIN STRING_SPLIT(@orderids, ',') AS K
       ON O.orderid = CAST(K.value AS INT);
GO

EXEC dbo.GetOrders @orderids = '10248,10249,10250';
```

- Note: cardinality estimate always fixed 50



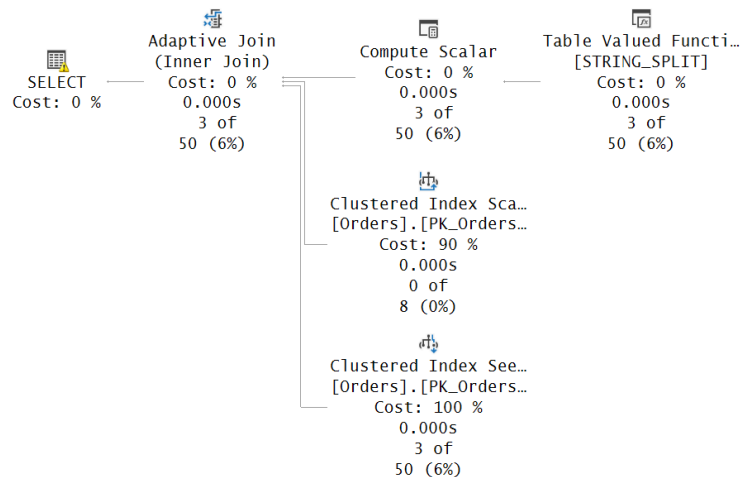
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Adaptive join solves fixed cardinality issue

```
CREATE NONCLUSTERED COLUMNSTORE INDEX idx_dontworrybehappy  
ON Sales.Orders(orderid)  
WHERE orderid = -1 AND orderid = -2;
```

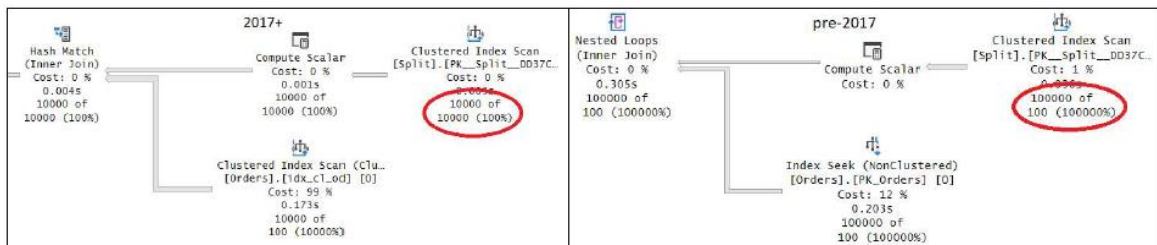


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Interleaved execution

- Introduced in SQL Server 2017
- Used with queries involving multi-statement TVFs
- Initially optimize only until node representing table variable
- Once have actual number of rows, optimize remaining plan

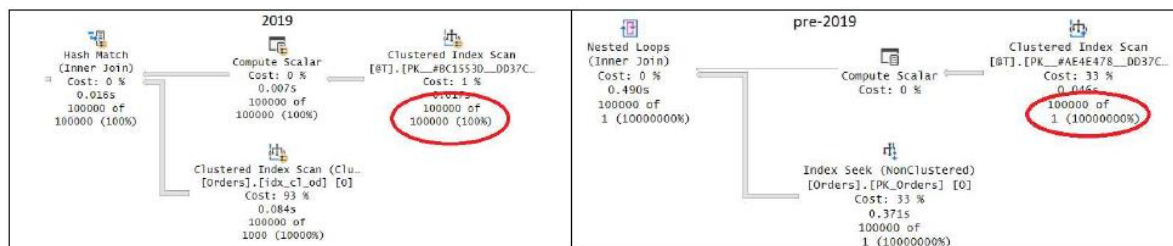


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Table variable deferred compilation

- Introduced in SQL Server 2019
- Similar to interleaved execution, but with regular table variables



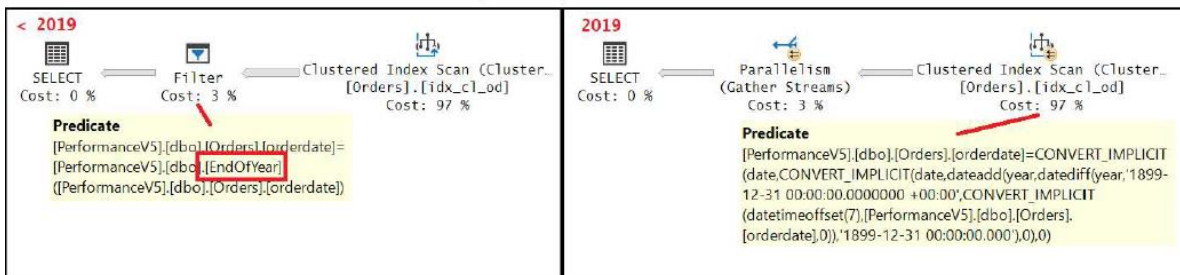
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Scalar UDF inlining

- Pre-2019 scalar UDFs did not get inlined and were a parallelism inhibitor
- SQL Server 2019 introduces scalar UDF inlining under certain conditions
<https://docs.microsoft.com/en-us/sql/relational-databases/user-defined-functions/scalar-udf-inlining>
- Not just for RETURN <single expression>, also DECLARE, SET, IF get converted into relational counterparts such as CASE

SELECT * FROM dbo.Orders WHERE orderdate = dbo.EndOfYear(orderdate)



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Memory grant feedback

- Memory grant correction over multiple executions for queries with cached plans
- 2017 introduces support for batch mode memory grant feedback
- 2019 adds support for row mode as well

Warnings

The query memory grant detected "ExcessiveGrant", which may impact the reliability. Grant size: Initial 107992 KB, Final 107992 KB, Used 1288 KB.

1

MemoryGrantInfo	
DesiredMemory	107992
GrantedMemory	107992
GrantWaitTime	0
IsMemoryGrant	NoFirstExecution

2

MemoryGrantInfo	
DesiredMemory	3072
GrantedMemory	3072
GrantWaitTime	0
IsMemoryGrant	YesAdjusting

3

MemoryGrantInfo	
DesiredMemory	1728
GrantedMemory	1728
GrantWaitTime	0
IsMemoryGrant	YesStable

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APPLY

- Apply right table expression to each row from left table
- Table expression can have **correlations** (lateral/correlated join), can be TVF
- Left rows with no matches: discarded by CROSS APPLY, preserved by OUTER APPLY

```
SELECT C.custid, A.orderid, A.orderdate, A.empid
FROM Sales.Customers AS C
    CROSS APPLY ( SELECT TOP (3) orderid, orderdate, empid
                  FROM Sales.Orders AS O
                  WHERE O.custid = C.custid
                  ORDER BY orderdate DESC, orderid DESC ) AS A;
```

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Converting scalar UDFs to inline TVFs

- When scalar UDF does not get inlined

```
SELECT *  
FROM dbo.Orders  
WHERE orderdate = dbo.EndOfYear(orderdate);
```

- Convert to inline TVF if possible, and execute with APPLY

```
SELECT O.*  
FROM dbo.Orders AS O  
CROSS APPLY dbo.EndOfYear(orderdate) AS F  
WHERE O.orderdate = F.endofyear;
```

Using APPLY to get a seek-based strategy

- Example with MIN/MAX aggregate per group; normally you get a scan

```
SELECT empid, MAX(orderdate) AS maxod  
FROM dbo.Orders  
GROUP BY empid;
```

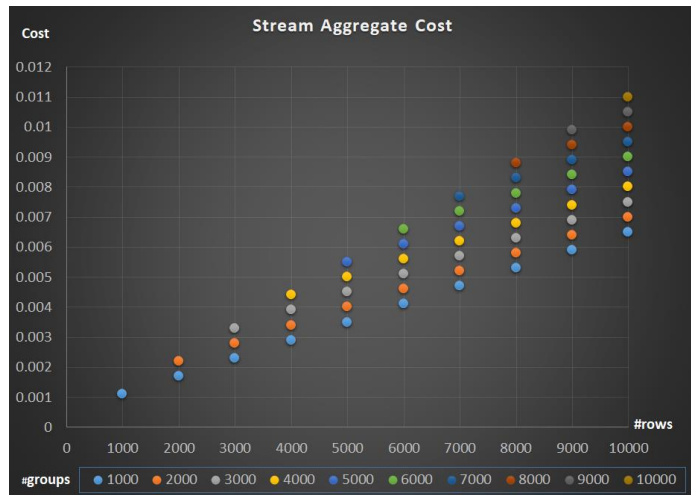
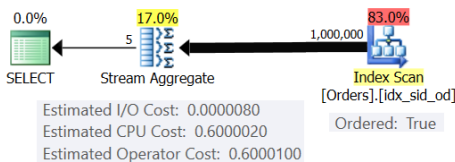
- Normal choices for grouped query:

- Preordered Stream Aggregate
- Sort + Stream Aggregate
- Hash Aggregate

** For details see Optimization Thresholds Parts 1 – 5
at sqlperformance.com/author/itzikbengan*

Preordered Stream Aggregate

- I/O cost: negligible
- CPU cost:
 $\#rows * 0.0000006$
 $+ \#groups * 0.0000005$
- Scaling: linear
- Used when supporting index exists

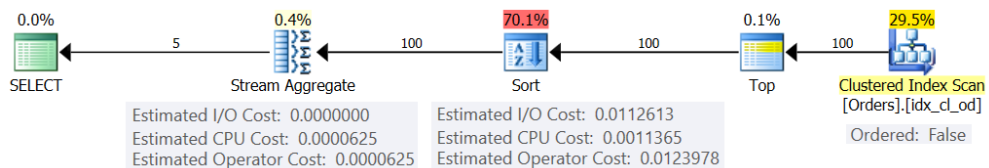


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Sort + Stream Aggregate

- Scaling: $n \log n$, negligible startup cost
- Used when:
 - no supporting index
 - small number of rows

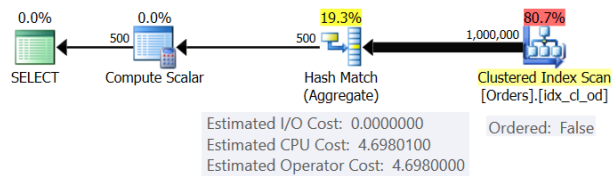


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Hash Aggregate

- Scaling: linear, higher startup cost than Sort + SA
- Used when:
 - no supporting index
 - large number of rows



orderid empid

320 3
30 5
660 253
820 3
850 1
1000 255
700 3
1240 253
350 4
400 255

hash function:
empid % 250

Before any rows are processed

0
1
2
3
4
5
6
7
8
9
...
248
249

After 5 rows are processed

0
1
2
3
4
5
6
7
8
9
...
248
249

→ 1, 1
→ 3, 2 → 253, 1
→ 5, 1

After 10 rows are processed

0
1
2
3
4
5
6
7
8
9
...
248
249

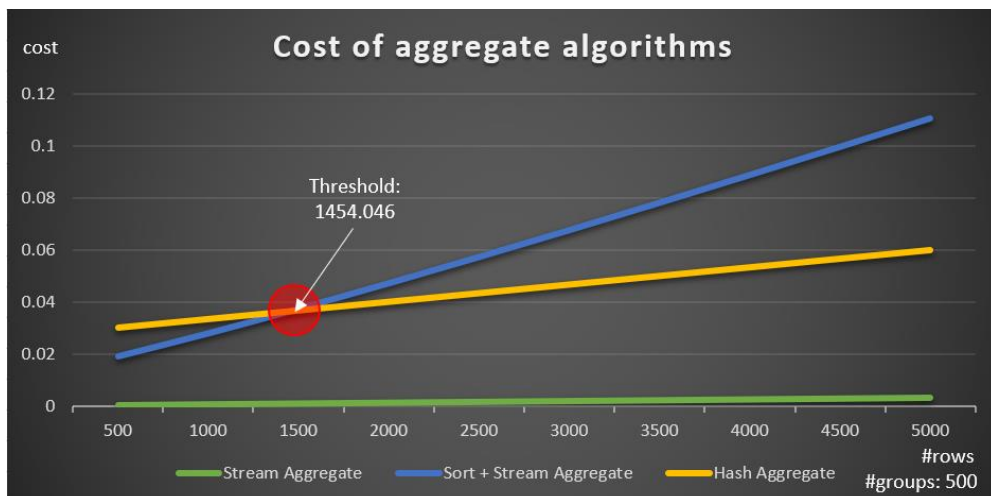
→ 1, 1
→ 3, 3 → 253, 2
→ 4, 1
→ 5, 1 → 255, 2

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Optimization threshold

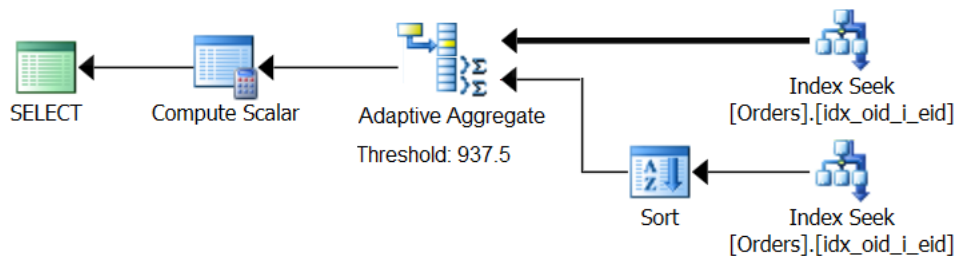


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Potential for Adaptive Aggregate operator

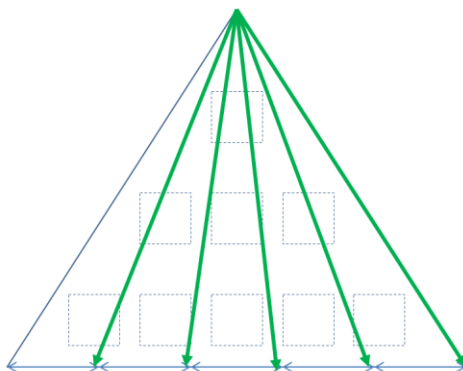


Wishful thinking

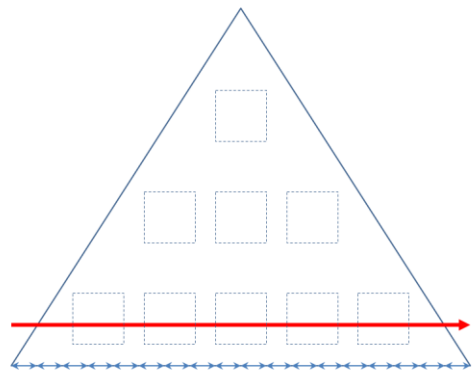
Scan versus seeks in grouped query

- Which is better?

High density: seeks



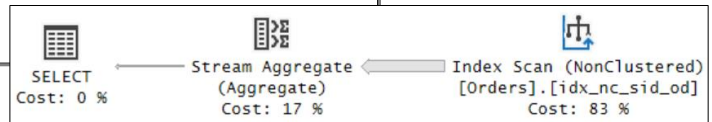
Low density: scan



Scan versus seeks in grouped query

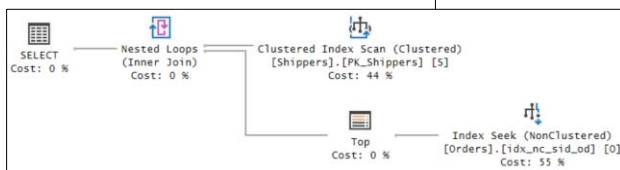
- Grouped query: scan

```
SELECT shipperid, MAX(orderdate) AS maxod
FROM dbo.Orders
GROUP BY shipperid;
```



- APPLY query: seeks

```
SELECT S.shipperid, O.maxod
FROM dbo.Shippers AS S
CROSS APPLY ( SELECT TOP (1) O.orderdate
FROM dbo.Orders AS O
WHERE O.shipperid = S.shipperid
ORDER BY O.orderdate DESC ) AS O(maxod);
```

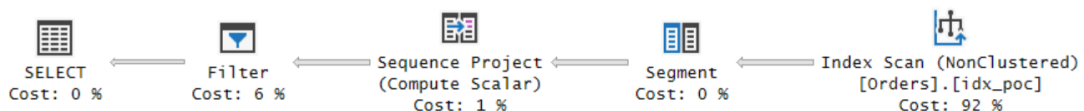


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Top N per group

- To get a scan use ROW_NUMBER

```
WITH C AS
(
  SELECT
    ROW_NUMBER() OVER(
      PARTITION BY custid
      ORDER BY orderdate DESC, orderid DESC) AS rownum,
    orderid, orderdate, custid, empid
  FROM Sales.Orders
)
SELECT custid, orderdate, orderid, empid
FROM C
WHERE rownum <= 3;
```

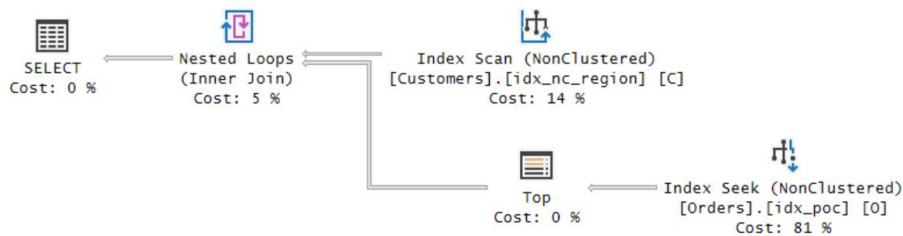


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Top N per group

- To get seeks use APPLY

```
SELECT C.custid, A.*
FROM Sales.Customers AS C
  CROSS APPLY ( SELECT TOP (3) orderid, orderdate, empid
                FROM Sales.Orders AS O
                WHERE O.custid = C.custid
                ORDER BY orderdate DESC, orderid DESC ) AS A;
```



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Many other uses of APPLY

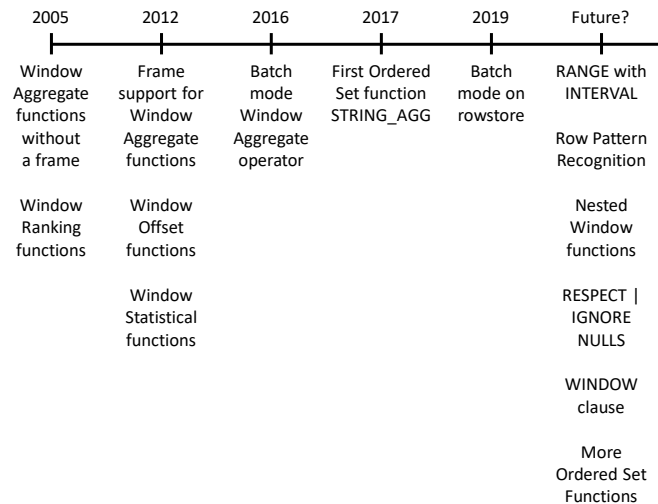
- Reuse of column aliases
- Aggregate over columns (alternative to GREATEST/LEAST)
- Flexible unpivoting with multiple measures and control over NULLs
- MIN/MAX over partitioned tables
- And many others...

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Window functions



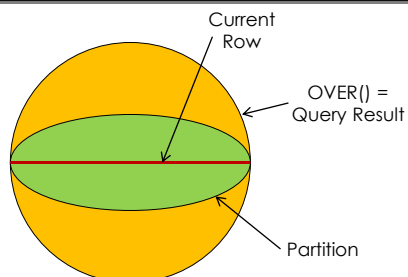
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Frameless aggregates

- Support optional window partition clause
- Do not involve a window order clause
- Not very optimal under row mode, but very optimal under batch mode

```
SELECT orderid, custid, val,
       CAST(100. * val / SUM(val) OVER() AS NUMERIC(5, 2)) AS pctall,
       CAST(100. * val / SUM(val) OVER(PARTITION BY custid) AS NUMERIC(5, 2)) AS pctcust
FROM Sales.OrderValues;
```



orderid	custid	val	pctall	pctcust
10643	1	814.50	19.06	20.55
10692	1	878.00	20.55	7.72
10835	1	330.00	7.72	19.79
10952	1	845.80	19.79	11.03
11011	1	471.00	11.03	21.85
10926	2	514.40	21.85	36.87
10759	2	320.00	36.87	34.20
10625	2	479.75	34.20	6.33
10308	2	88.80	6.33	

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Ranking

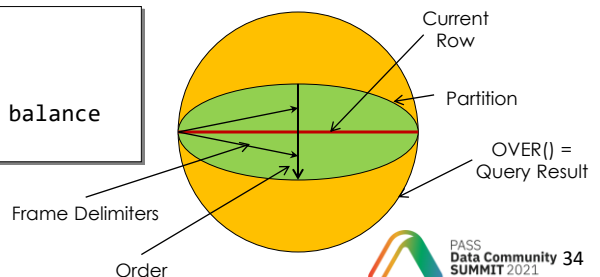
- Provide ranking values to rows in target partition
- Supported functions: ROW_NUMBER, RANK, DENSE_RANK, NTILE
- Support optional window partition clause and mandatory window order clause
- Benefit from POC index to avoid sort (relevant to all window functions)

```
SELECTorderid, qty,  
    ROW_NUMBER() OVER(ORDER BY qty) AS rownum,  
    RANK() OVER(ORDER BY qty) AS rnk,  
    DENSE_RANK() OVER(ORDER BY qty) AS densernk,  
    NTILE(4) OVER(ORDER BY qty) AS ntile4  
FROM dbo.Orders;
```

Framed aggregates

- A frame is a restricted portion of a partition
- Use window order clause to define order in partition
- Use ROWS or RANGE to define delimiters
- Optimization of RANGE under row mode uses an on-disk spool
- When window order clause specified without unit, defaults to RANGE!

```
SELECT actid, tranid, val,  
    SUM(val) OVER(PARTITION BY actid  
        ORDER BY tranid  
        ROWS UNBOUNDED PRECEDING) AS balance  
FROM dbo.Transactions;
```



Offset

- Apply offset calculation to retrieve element from previous (LAG), next (LEAD) first (FIRST_VALUE), last (LAST_VALUE) row
- Support optional window partition clause and mandatory window order clause
- Warning: FIRST_VALUE and LAST_VALUE work with a frame; absent an explicit frame specification, you get RANGE UNBOUNDED PRECEDING by default

```
SELECT custid, orderid, orderdate, qty,  
    LAG(qty) OVER(PARTITION BY custid ORDER BY orderdate, orderid) AS prevqty,  
    LEAD(qty) OVER(PARTITION BY custid ORDER BY orderdate, orderid) AS nextqty  
FROM dbo.Orders;
```

```
SELECT custid, orderid, orderdate, qty,  
    FIRST_VALUE(qty) OVER(PARTITION BY custid ORDER BY orderdate, orderid  
        ROWS BETWEEN UNBOUNDED PRECEDING AND CURRENT ROW) AS firstqty,  
    LAST_VALUE(qty) OVER(PARTITION BY custid ORDER BY orderdate, orderid  
        ROWS BETWEEN CURRENT ROW AND UNBOUNDED FOLLOWING) AS lastqty  
FROM dbo.Orders;
```

Statistical

- Apply statistical calculations like percentiles and percentile ranks
- Support optional partitioning and mandatory within group ordering
- Not very optimal under row mode, but very optimal under batch mode

```
SELECT DISTINCT empid,  
    PERCENTILE_CONT(0.5) WITHIN GROUP(ORDER BY qty) OVER(PARTITION BY empid) AS median_cont,  
    PERCENTILE_DISC(0.5) WITHIN GROUP(ORDER BY qty) OVER(PARTITION BY empid) AS median_disc  
FROM dbo.Orders;
```

Batch mode Window Aggregate

- Introduced in SQL Server 2016
- Improves many inefficiencies beyond supporting optimal batch mode
- Pre-2019 requires a columnstore index to be present even if not used
- Can use backdoor with dummy filtered columnstore index to enable

Row mode



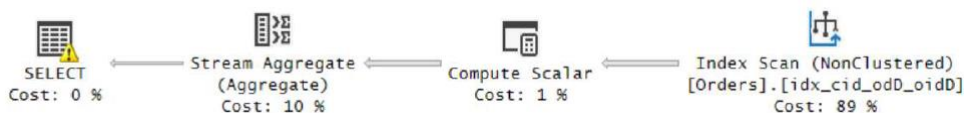
Batch mode



String concatenation

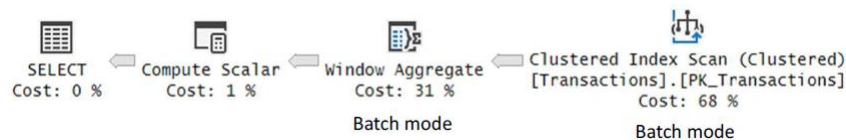
- Introduced in SQL Server 2017, as ordered set function

```
SELECT custid,  
       STRING_AGG(CAST(orderid AS VARCHAR(10)), ',')  
         WITHIN GROUP(ORDER BY orderdate DESC, orderid DESC) AS orderids  
FROM Sales.Orders  
GROUP BY custid;
```



Batch mode on rowstore (covered earlier)

- Introduced in SQL Server 2019
- Doesn't require columnstore indexes to be present
- Allows scanning of rowstore data to happen natively in batch mode with no adapters
- Requires EE and certain conditions based on heuristics to be met (see queryprocessor.com/batch-mode-on-row-store), so backdoor could still be useful!



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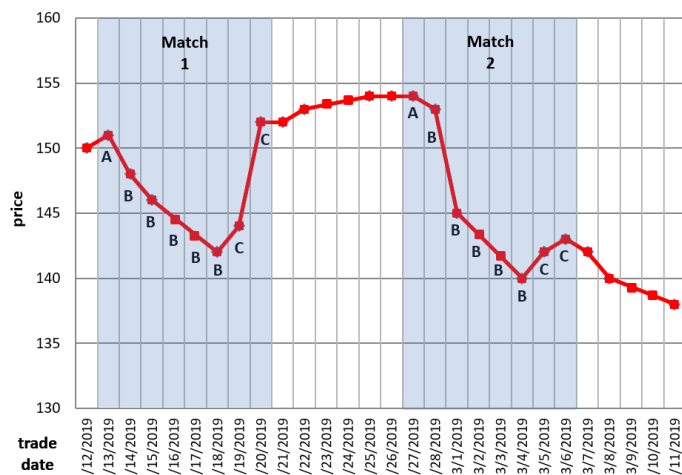


Missing, row pattern recognition (RPR)

```

SELECT
  MR.symbol, MR.matchnum, MR.startdate, MR.startprice,
  MR.bottomdate, MR.bottomprice, MR.enddate, MR.endprice, MR.maxprice
FROM dbo.Ticker
MATCH_RECOGNIZE
(
  PARTITION BY symbol
  ORDER BY tradedate
  MEASURES
    MATCH_NUMBER() AS matchnum,
    A.tradedate AS startdate,
    A.price AS startprice,
    LAST(B.tradedate) AS bottomdate,
    LAST(B.price) AS bottomprice,
    LAST(C.tradedate) AS enddate,
    LAST(C.price) AS endprice,
    MAX(price) AS maxprice
  PATTERN (A B+ C+)
  DEFINE
    -- A defaults to True
    B AS B.price < PREV(B.price),
    C AS C.price > PREV(C.price)
) AS MR;
  
```

V Shapes for STOCK1



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Missing, nested window functions

- Interact with points in window as an argument of an aggregate function:

BEGIN_PARTITION, BEGIN_FRAME, CURRENT_ROW, FRAME_ROW, END_FRAME, END_PARTITION

```
-- cur value minus average without first and last orders for customer
SELECT orderid, custid, orderdate, val,
       val - AVG( CASE
                   WHEN ROW_NUMBER(FRAME_ROW) NOT IN ( 1, ROW_NUMBER(END_PARTITION) ) THEN val
                   END )
       OVER( PARTITION BY custid ORDER BY orderdate, orderid
             ROWS BETWEEN UNBOUNDED PRECEDING AND UNBOUNDED FOLLOWING ) AS diff
FROM Sales.OrderValues;

-- cur value minus average without cur order date for customer
SELECT orderid, custid, orderdate, val,
       val - AVG( CASE WHEN orderdate <> VALUE OF orderdate AT CURRENT_ROW THEN val END )
       OVER( PARTITION BY custid ) AS diff
FROM Sales.OrderValues;
```

Missing, NULL treatment clause

- Available in SQL standard to offset window functions (LAG, LEAD, FIRST_VALUE, LAST_VALUE)
- IGNORE NULLS means keep going until a non-NULL value found

```
SELECT id, col1, COALESCE(col1, LAG(col1) IGNORE NULLS OVER(ORDER BY id)) AS lastval
FROM dbo.T1;
```

- Workaround

```
WITH C AS
(
  SELECT id, col1,
         MAX(CASE WHEN col1 IS NOT NULL THEN id END)
         OVER(ORDER BY id ROWS UNBOUNDED PRECEDING) AS grp
  FROM dbo.T1
)
SELECT id, col1,
       MAX(col1) OVER(PARTITION BY grp ORDER BY id ROWS UNBOUNDED PRECEDING)
FROM C;
```

Solutions using window functions

- Gaps
- Islands
- Creating auxiliary table of numbers (see GetNums function)
- Identifying maximum number of concurrent intervals
- Packing intervals
- And many others...

OFFSET-FETCH

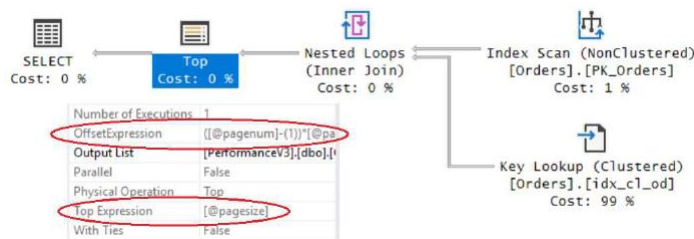
- Similar to TOP but with skipping capability
- Useful for paging, but also tasks like median with high density groups
- Connected entirely to the ORDER BY
- OFFSET: rows to skip, FETCH: rows to filter

```
SELECT orderid, orderdate, custid, empid  
FROM Sales.Orders  
ORDER BY orderdate DESC, orderid DESC  
OFFSET 50 ROWS FETCH NEXT 25 ROWS ONLY;
```

OFFSET-FETCH

- Optimized with enhanced Top operator
- #rows scanned in index = Offset exp + Top exp

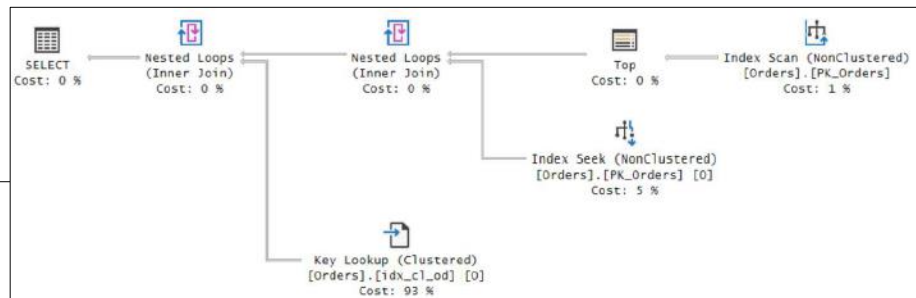
```
SELECT orderid, orderdate, custid, empid
FROM dbo.Orders
ORDER BY orderid
OFFSET (@pagenum - 1) * @pagesize ROWS FETCH NEXT @pagesize ROWS ONLY;
```



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OFFSET-FETCH

```
WITH Keys AS
(
    SELECT orderid
    FROM dbo.Orders
    ORDER BY orderid
    OFFSET (@pagenum - 1) * @pagesize ROWS
    FETCH NEXT @pagesize ROWS ONLY
)
SELECT O.orderid, O.orderdate, O.custid, O.empid
FROM dbo.Orders AS O
INNER JOIN Keys AS K
    ON O.orderid = K.orderid;
```



- Use CTE+join to avoid unnecessary lookups

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Review

- Search arguments
- Join ordering optimization
- Adaptive / Intelligent QP
 - Batch-mode processing and batch mode on rowstore
 - Adaptive joins
 - Interleaved execution and table variable deferred compilation
 - Scalar UDF inlining
 - Memory grant feedback
- APPLY
- Window functions
- OFFSET-FETCH

Session evaluation

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Thank you

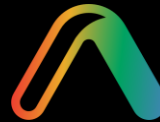
All you need is SQL
All you need is SQL
All you need is SQL, SQL
SQL is all you need

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