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Analyze this! Analytical power in SQL, more than you ever dreamt of

Andrew Witkowski Architect Hardware and Software **Engineered to Work Together**

Analytical SQL in the Database



- Pattern matching
- Top N clause
- Lateral Views, APPLY
- Identity Columns
- Column Defaults
- Data Mining III



- Enhanced Window functions (percentile,etc)
- Rollup, grouping sets,

Window functions cube 2001

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Introduction of

1998

2002

2004 📖 2005 📖

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- Data mining II
- **SQL** Pivot

2007 🗔

- **Recursive WITH**
- ListAgg, N Th value window

2009

- Statistical functions
- Sql model clause

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- Partition Outer Join
- Data mining I



2012



Pattern Recognition In Sequences of Rows The Challenge

"Find people that flew from country X to country Y, stayed there 2 days, then went to country Z, stayed there 30 days, contacted person A, and then withdrew \$10,000.00"

- Currently pattern recognition in SQL is difficult
 - Use multiple self joins (not good for *)
 - T1.person = T2.person AND T1.country= 'X' AND T2.country= 'Y' & T2.time BETWEEN T1.time and T1.time+2....

- Use recursive query for * (WITH clause, CONNECT BY)
- Use Window Functions (likely with multiple query blocks)

Pattern Recognition In Sequences of Rows

Objective

Provide native SQL language construct

Align with well-known regular expression declaration (PERL)

Apply expressions across rows

Soon to be in ANSI SQL Standard

"Find one or more event A followed by one B followed by one or more C in a 1 minute interval"



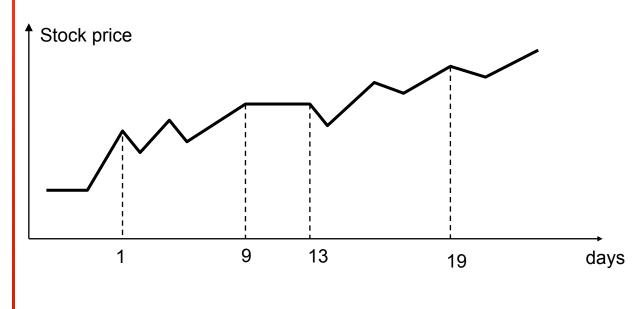
Pattern Recognition In Sequences of Rows "SQL Pattern Matching" - Concept

- Recognize patterns in sequences of events using SQL
 - Sequence is a stream of rows
 - Event equals a row in a stream
- New SQL construct MATCH_RECOGNIZE
 - Logically partition and order the data
 - ORDER BY mandatory (optional PARTITION BY)
 - Pattern defined using regular expression using variables
 - Regular expression is matched against a sequence of rows
 - Each pattern variable is defined using conditions on rows and aggregates

Example: Find Double Bottom (W)

Find double bottom (W) patterns and report:

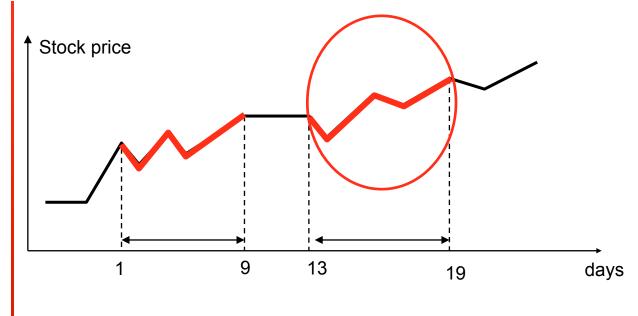
- Beginning and ending date of the pattern
- Average Price Increase in the second ascent
- Modify the search to find only patterns that lasted less than a week



Example: Find Double Bottom (W)

Find double bottom (W) patterns and report:

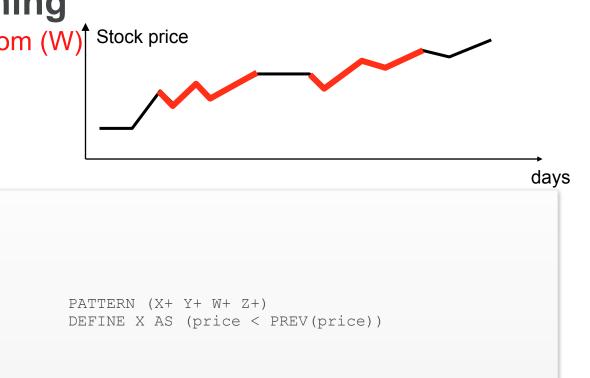
- Beginning and ending date of the pattern
- Average Price Increase in the second ascent
- Modify the search to find only patterns that lasted less than a week



Example: Find Double Bottom (W) Stock price

Find double bottom (W) patterns and report:

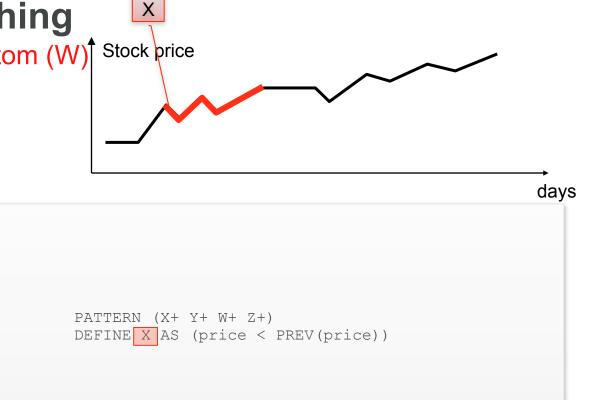
- Beginning and ending date of the pattern
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- Modify the search to find only patterns that lasted less than a week



Example: Find Double Bottom (W) Sto

Find double bottom (W) patterns and report:

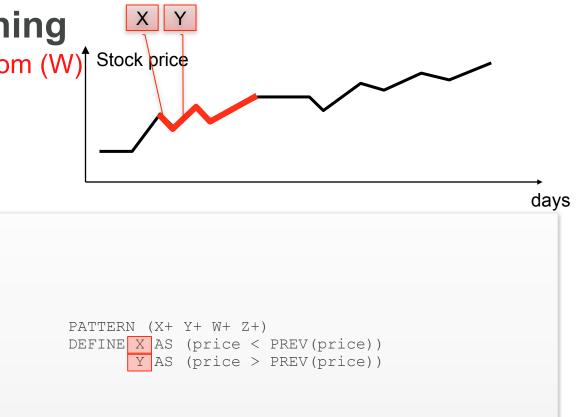
- Beginning and ending date of the pattern
- Average Price Increase in the second ascent
- Modify the search to find only patterns that lasted less than a week



Example: Find Double Bottom (W) S

Find double bottom (W) patterns and report:

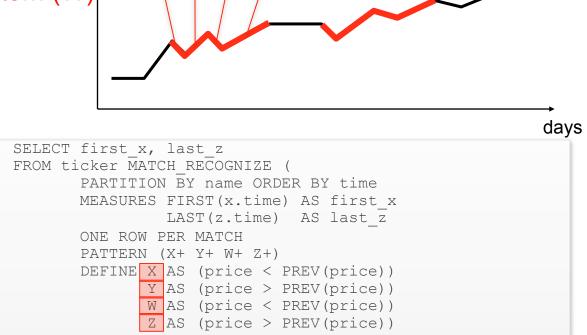
- Beginning and ending date of the pattern
- Average Price Increase in the second ascent
- Modify the search to find only patterns that lasted less than a week



Example: Find Double Bottom (W) Stock price

Find double bottom (W) patterns and report:

- Beginning and ending date of the pattern
- Average Price Increase in the second ascent
- Modify the search to find only patterns that lasted less than a week



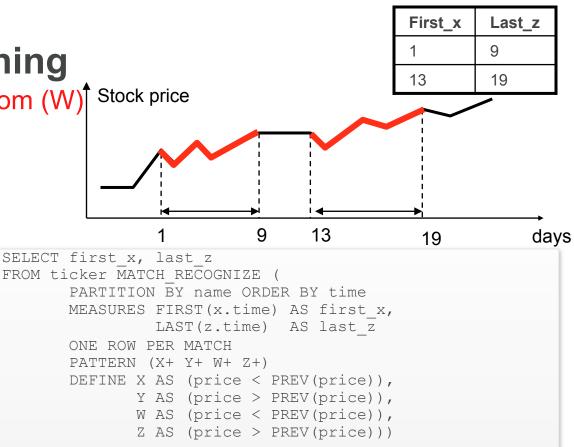
Example: Find Double Bottom (W) Stock pri

Find double bottom (W) patterns and report:

•Beginning and ending date of the pattern

•Average Price Increase in the second ascent

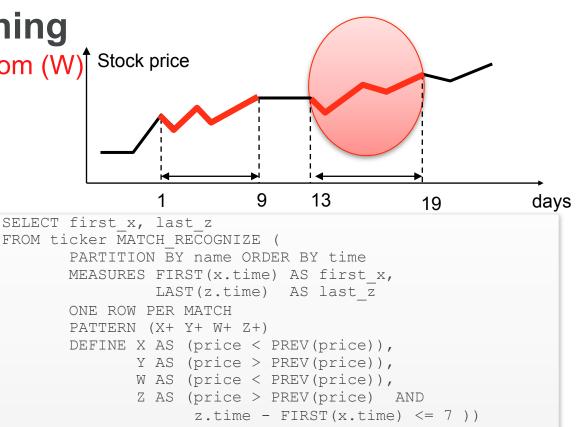
•Modify the search to find only patterns that lasted less than a week



Example: Find Double Bottom (W) Stock pr

Find double bottom (W) patterns and report:

- Beginning and ending date of the pattern
- Average Price Increase in the second ascent
- Modify the search to find only patterns that lasted less than a week



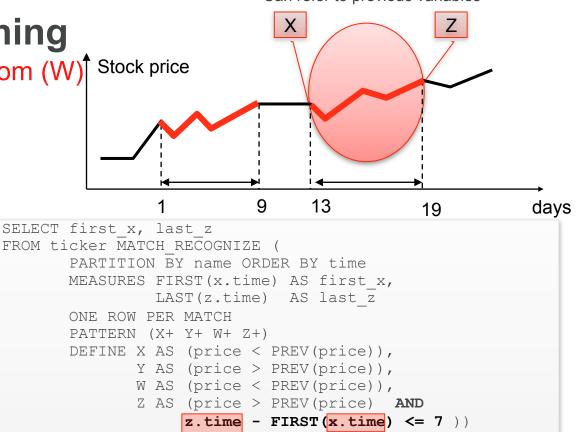
Can refer to previous variables

SQL Pattern Matching

Example: Find Double Bottom (W) Stock p

Find double bottom (W) patterns and report:

- Beginning and ending date of the pattern
- Average Price Increase in the second ascent
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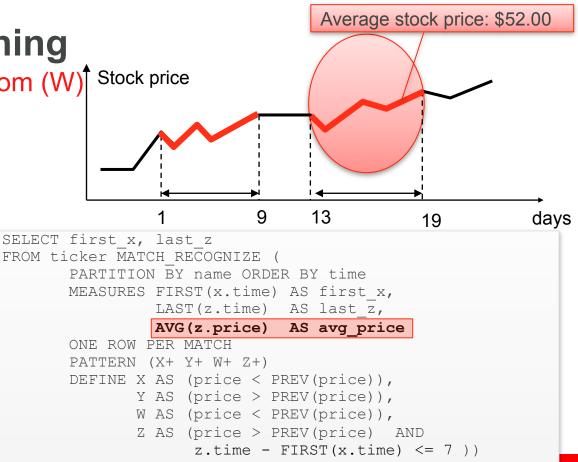
Example: Find Double Bottom (W) Stock pr

Find double bottom (W) patterns and report:

•Beginning and ending date of the pattern

•Average Price in the second ascent

•Modify the search to find only patterns that lasted less than a week



SQL Pattern Matching Syntax

```
 :=  MATCH RECOGNIZE
        ( [ PARTITION BY <cols> ]
          [ ORDER BY <cols> ]
          [ MEASURES <cols> ]
          [ ONE ROW PER MATCH | ALL ROWS PER MATCH ]
          [ SKIP TO option ]
         PATTERN ( <row pattern> )
          [ SUBSET <subset list> ]
         DEFINE <definition list>
```



"Declarative" Pattern Matching

- Matching within an ordered partition of data
 - MATCH_RECOGNIZE (PARTITION BY stock_name ORDER BY time MEASURES ...
- Use framework of Perl regular expessions (terms are conditions on rows)
 - PATTERN (X+ Y+ W+ Z+)
- Define matching using boolean conditions on rows
 - DEFINE

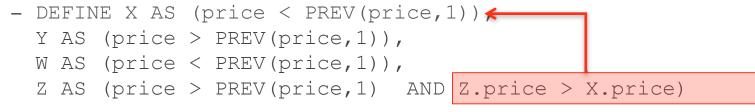
```
X AS (price > 15)
```

•••

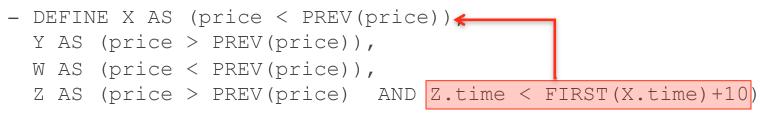


"Declarative" Pattern Matching, cont.

Name and refer to previous variables (i.e., rows) in conditions



New aggregates: FIRST, LAST



"Declarative" Pattern Matching, cont.

- Running aggregates in conditions on currently defined variables:
 - DEFINE X AS (price < PREV(price) AND AVG(num_of_shares) < 10), Y AS (price > PREV(price) AND count(Y.price) < 10), W AS (price < PREV(price)), Z AS (price > PREV(price) AND Z.price > Y.price)

• Final aggregates in conditions but only on previously defined variables

- DEFINE X AS (price < PREV(price)),
 Y AS (price > PREV(price)),
 W AS (price < PREV(price) AND count(Y.price) > 10),
 7 AS (price > PREV(price) AND 7 price > LAST(Y price))
 - Z AS (price > PREV(price) AND Z.price > LAST(Y.price))

"Declarative" Pattern Matching, cont.

• After match SKIP option :

- SKIP PAST LAST ROW
- SKIP TO NEXT ROW
- SKIP TO <VARIABLE>
- SKIP TO FIRST (<VARIABLE>)
- SKIP TO LAST (<VARIABLE>)

What rows to return

- ONE ROW PER MATCH
- ALL ROWS PER MATCH
- ALL ROWS PER MATCH WITH UNMATCHED ROWS

Building Regular Expressions

- Concatenation: no operator
- Quantifiers:
 - * 0 or more matches
 - + 1 or more matches
 - ? 0 or 1 match
 - {n} exactly n matches
 - {n,} n or more matches
 - {n, m} between n and m (inclusive) matches
 - {, m} between 0 an m (inclusive) matches
 - Reluctant quantifier an additional ?

Building Regular Expressions

- Alternation: |
 - A | B
- Grouping: ()
 - (A | B)+
- Permutation: Permute() alternate all permutations
 - PERMUTE (A B C) -> A B C | A C B | B A C | B C A | C A B | C B A
- ^: indicates beginning of partition
- \$: indicates end of partition

Preferment Rules – Follow Perl

- Greedy quantifiers: longer match preferred
- Reluctant quantifiers: shorter match preferred
- Alternation: left to right
- Make local choices
 - Example: for pattern (A | B)*, AAA preferred over BBBBB

"Declarative" Pattern Matching

Can subset variable names

SQL Pattern Matching ALL ROWS PER MATCH OPTION

Detect ALL login events after privileges have been revokes for the user.

Generate a row for first improper login attempt (event)

NAME	EVENT	TIME		NAME	REV_TIME	TIME	CLAS	
John	grant	9:00 AM		John	1:00 PM	1:00 PM	Х	
John	revoke	1:00 PM		John	1:00 PM	1:20 PM	Y	
John	fired	1:20 PM		John	1:00 PM	1:25 PM	Y	
John	escorted	1:25 PM			John	1:00 PM	1:30 PM	У
John	left	1:30 PM		John	1:00 PM	1:50 PM	Z	
John	login	1:50 PM						

SQL Pattern Matching ONE ROW PER MATCH OPTION

Detect each 3 or more consecutive login attempt (event) after privileges have been revoked

Login attempts all have to occur within 1 minute

			_			
NAME	EVENT	TIME		NAME	REV_TIME	FIRST_LOG
John	grant	9:00 AM		John	1:00 PM	1:30 PM
John	revoke	1:00 PM				
John	fired	1:20 PM				
John	left	1:25 PM				
John	login	1:30 PM				
John	login	1:31 PM				
John	login	1:32 PM				ORACLE

Sample use cases





Example Sessionization for user log

- Define a session as a sequence of one or more events with the same partition key where the inter-timestamp gap is less than a specified threshold
- Example "user log analysis"
 - Partition key: User ID, Inter-timestamp gap: 10 (seconds)
 - Detect the sessions
 - Assign a within-partition (per user) surrogate Session_ID to each session
 - Annotate each input tuple with its Session_ID

Example Sessionization for user log: ALL ROWS PER MATCH

```
SELECT time, user id, session id
FROM Events MATCH RECOGNIZE
      (PARTITION BY User ID ORDER BY time
       MEASURES match number() as session id
       ALL ROWS PER MATCH
       PATTERN (b s*)
       DEFINE
              s as (s.time - prev(s.time) <= 10)
       );
```

Example Sessionization for user log

			TIME	USER ID		TIME	USER ID	SESSION
TIME	USER ID		1	Mary		1	Mary	1
			11	Mary		11	Mary	1
1	Mary							
2	Sam		23	Mary	N I	23	Mary	2
11	Mary	Idantify			Number			
12	Sam	Identify	34	Mary	Sessions	34	Mary	3
22	Sam	sessions	44	Mary		44	Mary	3
23	Mary	000010110	53	Mary	per user	53	Mary	3
32	Sam	Ν	63	Mary	N	63	Mary	3
34	Mary							
43	Sam		2	Sam		2	Sam	1
44	Mary		12	Sam		12	Sam	1
47	Sam		22	Sam		22	Sam	1
48	Sam		32	Sam		32	Sam	1
53	Mary							
59	Sam		43	Sam		43	Sam	2
60	Sam		47	Sam		47	Sam	2
63	Mary		48	Sam		48	Sam	2
68	Sam		59	Sam		59	Sam	3
			60	Sam		60	Sam	3
			68	Sam		68	Sam	3

Example Sessionization – Aggregation of sessionized data

- Primitive sessionization only a foundation for analysis
 - Mandatory to logically identify related events and group them
- Aggregation for the first data insight
 - How many "events" happened within an individual session?
 - What was the total duration of an individual session?

Example Sessionization – Aggregation: ONE ROW PER MATCH

```
SELECT user id, session id, start time, no of events, duration
FROM Events MATCH RECOGNIZE
       ( PARTITION BY User ID ORDER BY time ONE ROW PER MATCH
         MEASURES match number() session id,
                 count(*) as no of events,
                 first(time) start time,
                 last(time) - first(time) duration
         PATTERN (b s*)
         DEFINE
                 s as (s.time - prev(time) <= 10)</pre>
ORDER BY user id, session id;
```

Example Sessionization – Aggregation of sessionized data

TIME	USER ID	SESSION
1	Mary	1
11	Mary	1
23	Mary	2
34	Mary	3
44	Mary	3
53	Mary	3
63	Mary	3
2	Sam	1
12	Sam	1
22	Sam	1
32	Sam	1
43	Sam	2
47	Sam	2
48	Sam	2
59	Sam	3
60	Sam	3
68	Sam	3

TIME	SESSION_ID	START_TIME	NUM EVENTS	DURATION
Mary	1	1	2	10
Mary	2	23	1	0
Mary	3	34	4	29
Sam	1	2	4	30
Sam	2	43	3	5
Sam	3	59	3	9

Example Sessionization – using window functions

```
CREATE VIEW Sessionized Events as
SELECT Time Stamp, User ID,
       Sum (Session Increment) over (partition by User ID order by Time Stampasc) Session ID
FROM (SELECT Time Stamp, User ID,
             CASE WHEN (Time Stamp - Lag(Time Stamp) over (partition by User ID order by Time Stampasc)) < 10
                  THEN 0 ELSE 1 END Session Increment
      FROM Events);
                                    SELECT User ID,
                                               Min(Time Stamp) Start Time,
                                               Count(*) No Of Events,
                                               (Max(Time Stamp) -Min(Time Stamp)) Duration
                                    FROM Sessionized Events
                                    GROUP BY User ID, Session ID
```

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ORDER BY User ID, Start Time;

Example Call Detail Records Analysis

- Scenario:
 - The same call can be interrupted (or dropped).
 - Caller will call callee within a few seconds of interruption. Still a session
 - Need to know how often we have interrupted calls & effective call duration
- The to-be-sessionized phenomena are characterized by
 - Start_Time, End_Time
 - Caller_ID, Callee_ID



Example Call Detail Records Analysis using SQL Pattern Matching

```
SELECT Caller, Callee, Start Time, Effective Call Duration,
        (End Time - Start Time) - Effective Call Duration
                    AS Total Interruption Duration,
        No Of Restarts, Session ID
FROM call details MATCH RECOGNIZE
        ( PARTITION BY Caller, Callee ORDER BY Start Time
           MEASURES
             A.Start Time AS Start Time,
             B.End Time AS End Time,
              SUM(B.End Time - A.Start Time) as Effective Call Duration,
              COUNT(B.*) as No Of Restarts,
             MATCH NUMBER() as Session ID
           PATTERN (A B*)
           DEFINE B as B.Start Time - prev(B.end Time) < 60) ;
```

Example Call Detail Records Analysis prior to Oracle Database 12c

```
With Sessionized Call Details as
(select Caller, Callee, Start Time, End Time,
      Sum(case when Inter Call Intrvl < 60 then 0 else 1 end)
      over (partition by Caller, Callee order by Start Time) Session ID
 from (select Caller, Callee, Start Time, End Time,
        (Start Time - Lag(End Time) over(partition by Caller, Callee order by Start Time)) Inter Call Intrvl
       from Call Details)),
Inter Subcall Intrvls as
(select Caller, Callee, Start Time, End Time,
      Start Time - Lag(End Time) over (partition by Caller, Callee, Session ID order by Start Time)
      Inter Subcall Intrvl,
      Session ID
    from Sessionized Call Details)
Select Caller, Callee,
      Min(Start Time) Start Time, Sum(End Time - Start Time) Effective Call Duration,
      Nvl(Sum(Inter Subcall Intrvl), 0) Total Interuption Duration, (Count(*) - 1) No Of Restarts,
       Session ID
from Inter Subcall Intrvls
group by Caller, Callee, Session ID;
```

Example Suspicious Money Transfers

- Detect suspicious money transfer pattern for an account
 - Three or more small amount (<2K) money transfers within 30 days
 - Subsequent large transfer (>=1M) within 10 days of last small transfer.
- Report account, date of first small transfer, date of last large transfer

TIME	USER ID	EVENT	AMOUNT	
1/1/2012	John	Deposit	1,000,000	
1/2/2012	John	Transfer	1,000	
1/5/2012	John	Withdrawal	2,000	Three small transfers within 30 days
1/10/2012	John	Transfer	1,500	
1/20/2012	John	Transfer	1,200	
1/25/2012	John	Deposit	1,200,000	
1/27/2012	John	Transfer	1,000,000	Large transfer within 10 days of last small transfer
2/2/20212	John	Deposit	500,000	

Example Suspicious Money Transfers

```
SELECT userid, first t, last t, amount
   FROM (SELECT * FROM event log WHERE event = 'transfer')
   MATCH RECOGNIZE
      PARTITION BY userid ORDER BY time
      MEASURES FIRST(x.time) first t, y.time last t, y.amount amount
      PATTERN (x{3,} Y)
      DEFINE X as (event='transfer' AND amount < 2000),
              Y as (event='transfer' AND amount >= 1000000 AND
                  last(X.time) - first(X.time) < 30 AND</p>
                    Y.time - last(X.time) < 10 )) 👞
                               Within 30 days of each other
Three or more transfers of small amount
                                                                   Within 10 days of last small
                                          Followed by a large transfer
                                                                                ORACLE
```

Example Suspicious Money Transfers - Refined

- Detect suspicious money transfer pattern between accounts
 - Three or more small amount (<2K) money transfers within 30 days
 - Transfers to different accounts (total sum of small transfers (20K))
 - Subsequent large transfer (>=1M) within 10 days of last small transfer.
- Report account, date of first small transfer, date last large transfer

TIME	USER ID	EVENT	TRANSFER_TO	AMOUNT	
1/1/2012	John	Deposit	-	1,000,000	
1/2/2012	John	Transfer	Bob	1,000	Three small transfere within 20 days
1/5/2012	John	Withdrawal	-	2,000	Three small transfers within 30 days
1/10/2012	John	Transfer	Allen	1,500	to different acct and total sum < 20K
1/20/2012	John	Transfer	Tim	1,200	
1/25/2012	John	Deposit		1,200,000	
1/27/2012	John	Transfer	Tim	1,000,000	Large transfer within 10 days of last sn
2/2/20212	John	Deposit	-	500,000	· - ·

Example Suspicious Money Transfers - Refined

```
SELECT userid, first t, last t, amount
FROM (SELECT * FROM event log WHERE event = 'transfer')
MATCH RECOGNIZE
  PARTITION BY userid ORDER BY time
   MEASURES FIRST(x.time) first t, y.time last t, y.amount amount
                                                                 First small transfer
   PATTERN (z \times \{2, \} \vee)
   DEFINE z as (event='transfer' and amount < 2000),
                                                                 Next two or more small
            x as (event='transfer' and amount < 2000 AND
                                                                 transfers to different accts
                 prev(x.transfer to) <> x.transfer to ),
            y as (event='transfer' and amount >= 1000000 AND
                     last(x.time) - first(x.time) < 30 AND</pre>
                     y.time - last(x.time) < 10 AND
                                                                 Sum of all small transfers
                                                                 less then 20000
                     SUM(x.amount) + z.amount < 20000)
```

Native Top N Support





Native Support for TOP-N Queries

Natively identify top N in SQL

Significantly simplifies code development

ANSI SQL:2008

"Who are the top 5 money makers in my enterprise?"

```
SELECT empno, ename, deptno
FROM emp
ORDER BY sal, comm FETCH FIRST 5 ROWS;
```

versus

```
SELECT empno, ename, deptno
FROM (SELECT empno, ename, deptno, sal, comm,
            row_number() OVER (ORDER BY sal,comm) rn
        FROM emp
        )
WHERE rn <=5
ORDER BY sal, comm;</pre>
```

Native Support for TOP-N Queries

New offset and fetch_first clause

- ANSI 2008/2011 compliant with some additional extensions
- Specify offset and number or percentage of rows to return
- Provisions to return additional rows with the same sort key as the last row (WITH TIES option)
- Syntax:

```
OFFSET <offset> [ROW | ROWS]
FETCH [FIRST | NEXT]
[<rowcount> | <percent> PERCENT] [ROW | ROWS]
[ONLY | WITH TIES]
```

Native Support for TOP-N Queries Internal processing

Find 5 percent of employees with the lowest salaries

SELECT employee_id, last_name, salary
FROM employees

ORDER BY salary

FETCH FIRST 5 percent ROWS ONLY;



Native Support for TOP-N Queries Internal processing, cont.

• Find 5 percent of employees with the lowest salaries

```
SELECT employee id, last name, salary
FROM employees

    Internally the query is transformed into an equivalent query using window functions

ORDER BY salary
                         SELECT employee id, last name, salary
FETCH FIRST 5 per
                         FROM (SELECT employee id, last_name, salary,
                                        row number() over (order by salary) rn,
                                        count(*) over () total
                                FROM employee)
                         WHERE rn <= CEIL(total * 5/100);

    Additional Top-N Optimization:

                          SELECT list may include expensive PL/SQL function or costly expressions
                           Evaluation of SELECT list expression limited to rows in the final result set
```

Analytical SQL in the Database



Pattern matching

- Top N clause
- Lateral Views, APPLY
- Identity Columns
- Column Defaults
- Data Mining III





 Introduction of Window functions 1998



2001

 Enhanced Window functions (percentile,etc)

• Rollup, grouping sets, cube

2002 📖

2004 📖 2005 📖

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- Data mining II
- **SQL** Pivot

2007 🗔

- **Recursive WITH**
- ListAgg, N Th value window

2009

- Statistical functions
- Sql model clause

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- Partition Outer Join
- Data mining I

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Hardware and Software Engineered to Work Together



