#### CS698F Advanced Data Management

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#### First assignment presentations On Sept 6 and 8



We stopped here in our query, hence *:hasFriend* matrix has redundent tuple.



Once done with semi-joins, perform multi-way-pipelined join. Starting from any table/matrix, continue recursively matching the cells from its neighbors, output one result when done matching across all matrices. When matched **all** the cells in **all** the matrices  $\rightarrow$  you have generated all the results

CS698F Adv Data Mgmt

# Cyclic graph of tables



## Cyclic graph of tables

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## Cyclic graph of tables



### Multi-way-join cyclic queries



(1, 3) match  $(3,...) \rightarrow (1, 3), (3, 6)$ Match (3, 6) to (..., 6)(1, 3), (3, 6), (2, 6)

WAIT! Mismatch in (**1**, 3) (**2**, 6) Discard the match, and backtrack.

3rd row in mat-2 has only 1 bit, so again backtrack.

 $(2, 4) \text{ match } (4,...) \rightarrow (2, 4), (4, 5)$ Match (4, 5) to (..., 5)(2, 4) (4, 5) (1, 5) mismatch!

Root

#### Redundant cycles



#### Data compression

- Adjacency matrices are very sparse.
- Few 1 bits and lot of 0 bits.
- Compression techniques
  - Run-length-encoding
  - Byte-aligned Bitmap Code (BBC)
  - Word Aligned Hybrid (WAH)
  - Patitioned Word-Aligned Hybrid (PWAH)
  - Others

## **Run-length-encoding**



## Handling compressed data

- How to do Boolean AND/OR on compressed bitvector?
  - Without uncompressing, go on reading run-lengths
  - e.g. [0] 3 1 3 AND [1] 1 3 1 => [0] 3... slide the window
  - [1] 1 3... AND [0] 1 1 => [0] 1 add to the prev => [0] 4... so on
  - For very sparse vs dense vector, go over set bits in sparse vector and check respective set bits in dense one (AND)
  - OR on dense vectors expensive

### Boolean AND



### **Boolean OR**



### **Delta-encoding**

#### 1234, 1236, 1240, 2000, 2011, 2015.....

1234, 2, 4, 760, 11, 4.....

Used in B+ tree clustered indexes

Can you use it in unclustered indexes?

Can you use it in hash-indexes?

Only very first integer requires 4 bytes. The following integers can be stored using 2 bytes.

## **Delta-encoding**

- Similar to the RLE encoding, keep a sliding window of 4byte integer to slide over the sorted list computing the original int value on the fly.
- Gives about 50% storage space saving
  - To perform lesser I/O
  - Save disk space
  - Maintain same indexing performance (or better due to lesser I/O)

## **Distributed Storage**

- Topologies (architecture):
  - Peer-to-peer no hierarchy, shared nothing
    - Pastry, Chord, CAN systems
  - Hierarchical one or more masters, several slaves
    - MapReduce based frameworks Hadoop, SPARK, and many others

#### Peer-to-peer



Source: Google images

#### Hierarchical



### Cloud



#### Source: Google images

#### P2P

- Every compute-node knows every other node.
- Every compute-node has a unique ID
- Data gets distributed by some function f(d<sub>i</sub>) applied on each data item d<sub>i</sub>
- The output of the  $f(d_i)$  compared with node-id
- Data item sent to node whose ID is closest to  $f(d_i)$

#### P2P

- How to decide the *function*?
  - Simplest is "distribted hash table" (DHT)
  - Uses a *hash* function.
- Compute-node IDs generated using the same function, using IP address or MAC etc as the data to be hashed.
  - It can even be random ID generation and allocation
- Data can be anything, text, graphs, tables.
  - Data item to hash on changes as per data type!

# P2P (graphs)

- Decide data-unit to hash
  - A node? <hash(vertex-label), adj vertices> (incoming or outgoing)?
  - An edge? <hash(s, p, o), s,p,o>
- How do you decide data-unit to hash?
  - Depends on the query types.
  - Why?

# P2P (graphs)

- What do you join on?
  - Vertices or edges?
- So for distributed data what information do you need in one place?
  - Vertex labels?
  - Edge labels?
  - Why?