# Extending In-Memory Relational Database Engines with Native Graph Support

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#### Motivation

- Graphs are ubiquitous (e.g., road networks, social networks, biological networks, data-center networks)
- Specialized graph systems are not as mature as RDBMSs
- Graph-Relational queries are pervasive in many applications
  - Queries containing graph operations, (e.g., shortestpaths) and relational predicates
  - E.g., select specific users from relational tables, then find their nearest hospitals using shortest-path over a road-network
- Vanilla RDBMSs cannot evaluate deep-traversal queries effi-

#### **Creating Graph Views in GRFusion**

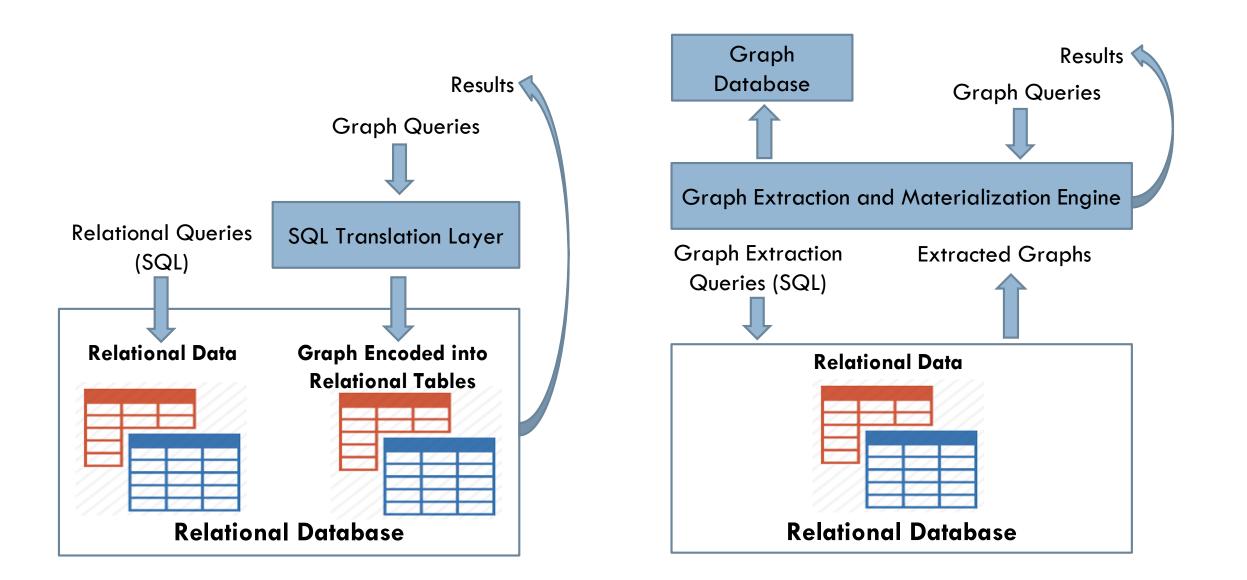
Figure 3: Creating a Social-Network Graph-View Example.

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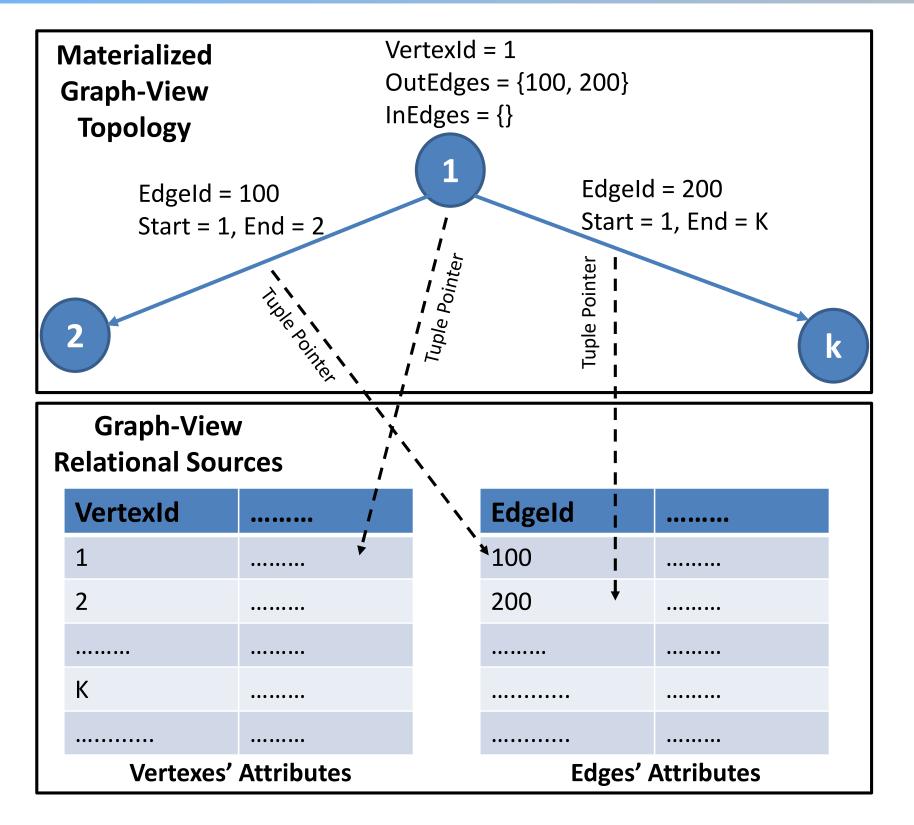
- Large intermediate results of the join operations
- Inaccurate cardinality estimation

#### **Existing Approaches**

- Native Relational-Core
  - Deep-traversal queries are inefficient to evaluate
  - Graphs are encoded in complex schemas
- Native Graph-Core
  - Graphs are extracted from RDBMS into graph-core
  - Graph updates require graph re-extraction
  - Queries cannot reference non-extracted relational data



#### Lightweight Graph Views in GRFusion



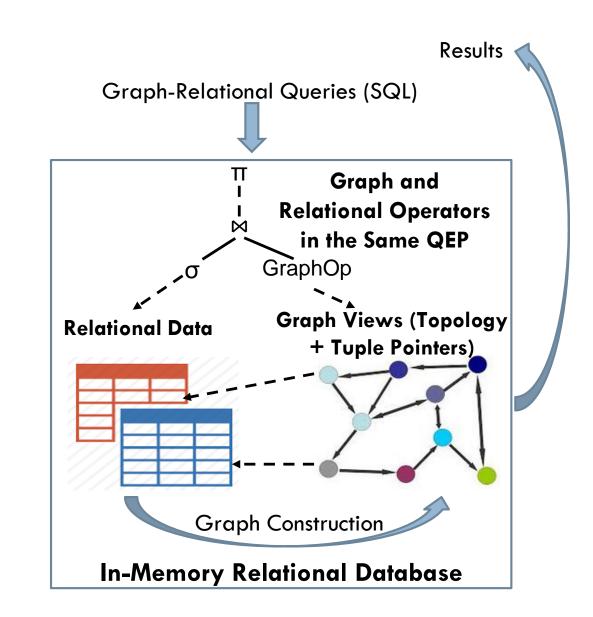
**Figure 4:** A graph view materializes the topology and holds pointers to the relational data of the vertexes and the edges.

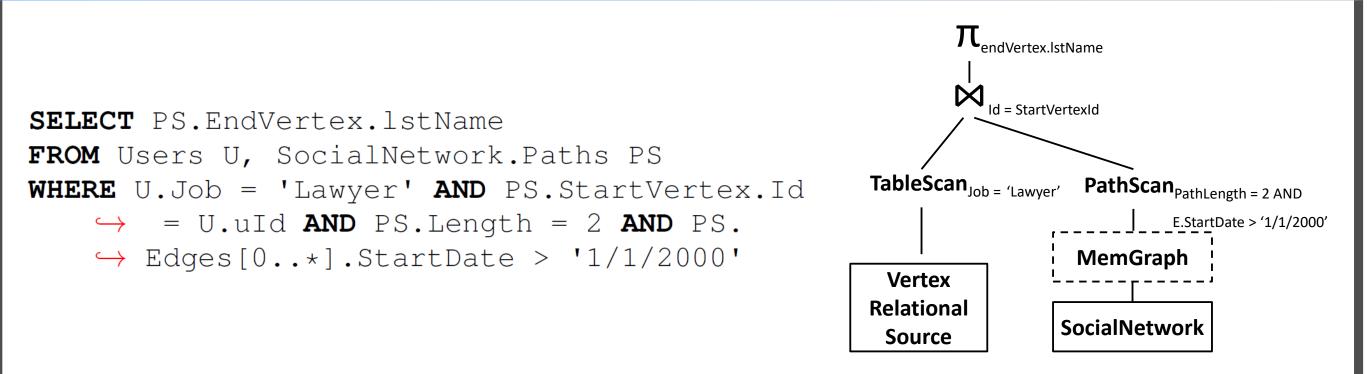
#### The PATHS Construct and Cross-Model QEPs

Figure 1: Existing approaches for leveraging relational databases to support graph processing.

## **Proposed Approach:** Native G+R Core

- Represent graphs as native graph structures
- Extend SQL to reference graphs in queries
- Support cross-data-model QEPs
- **GRFusion** realizes the Native G+R approach





**Figure 5:** GRFusion joins a table with a graph-view traversal-operator.

## **Graph-Traversal Query Examples**

#### SELECT TOP 2 PS

- - $\hookrightarrow$  Address = "Address 2"

Figure 6: Reachability and Shortest Path Queries in GRFusion.

#### **Experimental Results**

Reachability Queries (Tiger) → GRFusion → SQLGraph → Neo4j → Titan Reachability Queries (String) -⊷GRFusion ---SQLGraph -- Neo4j ---Titan

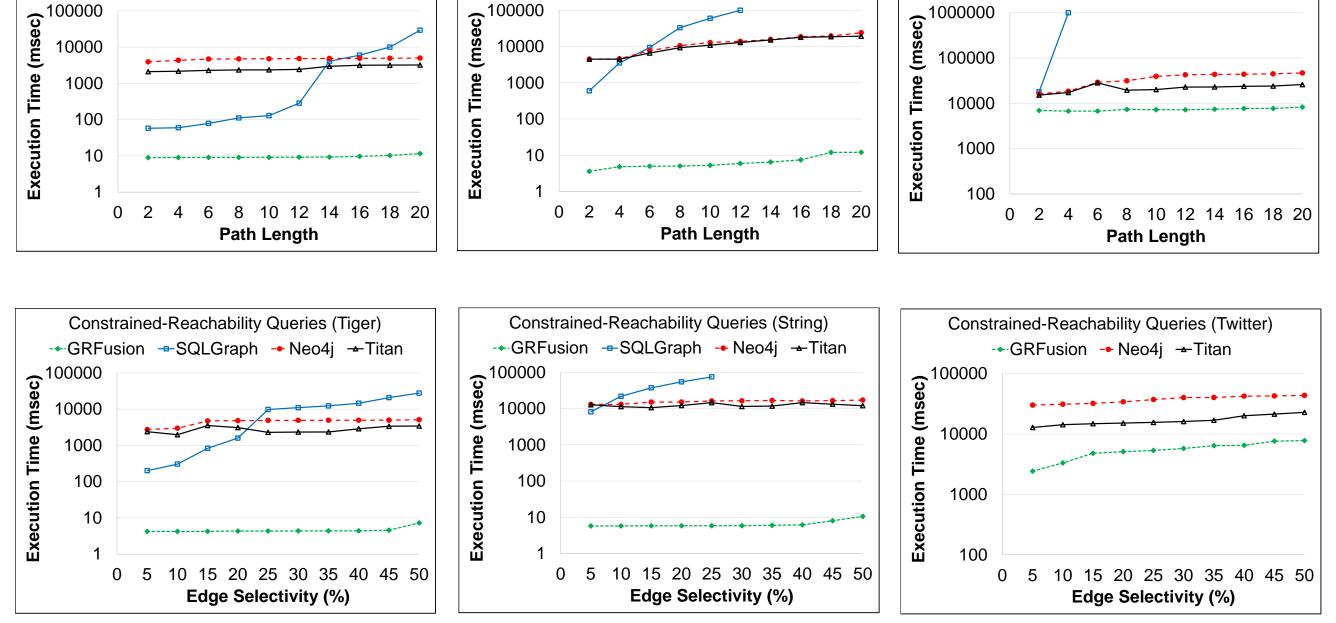
Reachability Queries (Twitter) ---GRFusion ---SQLGraph -- Neo4j ---Titan

Figure 2: The Native G+R Core Approach.

#### **Traversal Operators**

 ${\bf GRFusion}$  introduces the  ${\bf PathScan}$  logical operator

- Operate over a graph view
- Has three corresponding physical operators: **DFScan**, **BF-Scan**, and **SPScan**
- Specify the vertexes to start the traversal from
- The output extends the standard relational tuple, hence, the output can be ingested by any relational operator



**Figure 7:** GRFusion achieves up to four orders-of-magnitude query-time speedup for constrained and unconstrained reachability queries.