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Recap

Graph KeyW Search

### Advanced Data Management

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## Keyword Searches over Relational DB

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Graph KeyW Search

- Unlike plain text, the underlying data has inherent structure in it, which indirectly defines the relationship between the "data nodes" that contain those keywords.
- The underlying structure needs to be taken into consideration while determining the answers to the keyword searches.
- Hence the problem is no longer confined to just creating an inverted word to document ID index as is done in the IR approaches.
- Tuples are viewed as vertices in the "data-graph".
- Connections between the tuples are primary-foreign key constraints.
- Results to the keyword searches are *subgraphs* of this data-graph.

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### Schema-Based Keyword Search

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#### $\mathsf{Recap}$

- Two graphs considered graph of database relations, based on the schema (schema-graph G<sub>S</sub>), and graph of the tuples based on the schema (data-graph G<sub>D</sub>).
- Basic SQL queries are used to locate all the tuples that contain given keywords (or subsets of the given keywords).
- A Minimal Total Joining Network of Tuples (MTJNT) is such that – it is a subgraph of the data-graph, where two tuples are connected to each other if they have a primary-foreign key dependency, and they contain a subset of the query keywords. Together, all the tuples in a given subgraph covers all the given keywords.

## Schema-Based Keyword Search

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Graph KeyW Search

- Size of this subgraph is controlled with T<sub>max</sub> parameter to avoid arbitrarily large subgraphs. T<sub>max</sub> defines the maximum distance between the two tuples in the given subgraph.
- Additionally a scoring function is defined (domain specific) to avoid generating too many results, especially for frequently occuring keywords.

### Schema-based Keyword Search

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#### Recap

- Candidate Network Generation: A set of candidate networks (schema-subgraphs) are generated over the given database schema graph. These set of CNs will be complete and duplication free. Algorithms like DISCOVER [Hritidis2008] S-KWS [Markowetz2007] propose to propose a good set of CNs in order to avoid evaluation of a large number of them.
- Candidate network evaluation: After identifying CNs, they are translated into proper SQL queries in order to get the set of candidate tuple-subgraphs, i.e., to get *all* MTJNT for the each of the CNs.

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#### Recap

Graph KeyWd Search

### **Candidate network evaluation**: two main challenges:

- CNs share common subexpressions, so we want to identify and evaluate them only once to improve performance.
- Optimizing each of the SQL queries, and especially making use of these common subexpressions in the optimization plans.

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### Schema-based Keyword Search

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#### Recap

Graph KeyWo Search

### Without complete CN evaluation:

- Distinct root semantics: Define a distinct root, and identify all the tuples that are reachable within certain distance (D<sub>max</sub>) from the root tuple – this is more like a star graph than connected trees.
- Distinct core semantics: Instead of just one distinct root, define a community of roots, multi-centers that are connected to each other in the data-graph. Find tuples within D<sub>max</sub> distance of these multi-centers, over a path following certain path tuples.

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### Graph-based Keyword Search

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#### Recap

Graph KeyWo Search

- Does not consider DB schema, but considers tuples and their primary-foreign key dependencies as the connections.
- No use of structured queries like SQL.
- Tree-based or Subgraph-based semantics used to decide the structure of the tuple subgraphs to be returned.
- Tree-based semantics: (1) Steiner tree based semantics, and (2) Distinct root based semantics.

### Graph-based Keyword Search

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#### Recap

Graph KeyWc Search

- Finding optimal steiner trees is an NP-complete problem.
- But since the size of distinct keywords in the query and hence the size of the tuple subgraphs (constrained by the top-k scoring or weight function) is small, we can indeed find the optimal Steiner tree.
- BANKS-I [Bhalotia2002] uses backward search.
- Dynamic-Programming Best First (DPBF) [Ding2007] uses dynamic programming.

### Graph-based Keyword Search

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#### Recap

- BANKS-II proposes bidirectional search instead of just backward search.
- Bi-level indexing (BLINKS [He2007]) uses indexes to speed up BANKS-II.
- Data-graph summaries are created using graph of SuperNodes and SuperEdges. This graph can fit in memory and can be used to prune unwanted components of the data-graph to limit the search space and improve performance.

### Keyword Search over Native Graphs

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#### Recap

#### Graph KeyWd Search

- Ideas remain the same, but the data representation and interpretation changes.
- Graphs often don't have an associated schema, hence native schema-based approaches are not useful.
- Graphs like RDF have edge-labels which define the relationship and can be part of the keyword searches.
- Concept of distance can be more well-defined in terms of the edge-weights in the graphs.

# r-Cliques [Karger2011]

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#### Recap

- Does not assume underlying schema (schema-less).
- Instead of tree-based substructures, it assumes arbitrary subgraphs as the answers.
- Filtering criterion is that the distance between any two pair of nodes within the given substructure is at most "r".
- For outputting top-*k* results, it generates all the qualifying r-cliques and then does relative ranking among them to output top-*k*.
- Finding optimal r-cliques is NP-hard, hence they propose a branch and bound kind algorithm, which approximates r-cliques to a factor of 2, i.e., the distance between the pair of nodes in the candidate subgraph can be at most 2r.

### r-Cliques

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#### Recap

Graph KeyWd Search

- Branch and Bound:
  - For each keyword in the set of keywords {*k*<sub>1</sub>, *k*<sub>2</sub>...*k*<sub>*l*</sub>}, find all the graph nodes that contain that keyword use pre-built inverted index.
  - Initialize *rList* to contain all the nodes for a keyword say  $k_1$ .
  - For each k<sub>i</sub>, 2 ≤ i ≤ l, find all the nodes that contain k<sub>i</sub> and that are within r distance from the nodes in the rList. Add all such qualifying nodes to the respective rList.

### r-Cliques

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#### Recap

Graph KeyWd Search

- Branch and Bound is quite slow due to having to consider all the candidate nodes in a pairwise manner, hence authors propose Polynomial Delay Algorithm.
  - For each keyword in the set of keywords {k<sub>1</sub>, k<sub>2</sub>...k<sub>l</sub>}, find the respective graph nodes that contain the particular keyword {C<sub>1</sub>, C<sub>2</sub>...C<sub>l</sub>}.
  - Now consider the search space  $C_1 \times C_2 \times ... \times C_l$ , and from this find *one* top answer.
  - This is done by by iteratively choosing the shortest distance (less than r) node from every node in C<sub>i</sub> to every other set C<sub>j</sub>, i ≠ j.

### r-Cliques

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#### Recap

- After outputting the top answer from this space the space is divided as follows:
- If the top answer from the original search space was {v<sub>1</sub>, v<sub>2</sub>, V − 3, v<sub>4</sub>}, the space is divided into following subspaces:
  - $\{C_1 v_1\} \times C_2 \times C_3 \times C_4$ •  $C_1 \times \{C_2 - v_2\} \times C_3 \times C_4$
  - $C_1 \times C_2 \times \{C_3 v_3\} \times C_4$
  - $C_1 \times C_2 \times C_3 \times \{C_4 v_4\}$
- The procedure is repeated on these subspaces, until we have top-k answers, or until we can no longer produce an answer that satisfies the r distance criterion.

# Top-k Keyword Queries over RDF graphs [Tran2009]

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Recap

- Take an RDF graph and create a summary over it.
- Create an inverted index on the RDF data graph, and also consider IR techniques like stemming, synonyms etc.
- From a given set of keywords, first match the nodes in the summary graph, augmented with the nodes matching from the data graph.
- Form top-k SPARQL basic graph pattern queries based on various scoring parameters like path-lengths in the queries, populary score of the keywords, and keyword matching score.
- Evaluate the chosen top-k SPARQL queries over the original RDF graph to output results.
- Note that here query results can be larger than k because it is the SPARQL query candidates that are bounded by k!

### Key Points

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#### Recap

Graph KeyWd Search

- Other approaches more or less follow the same concepts.Key points to note:
  - Consider graph summaries for fast pruning of search space.
  - Inverted index for fast locating the candidate data and summary graph nodes.
  - Come up with SPARQL pattern (or SQL join) queries and evaluate them to get the candidate results, filter them based on scoring function and threshold criterion.
  - Use more native approaches like Steiner Trees, Distinct Root trees, Distinct Core, r-Cliques to get the top-k answers.