



Formal Languages in Information Extraction and Graph Databases

Wim Martens^(✉)

University of Bayreuth, Bayreuth, Germany
wim.martens@uni-bayreuth.de

This abstract covers two areas of data management research in which formal language theory plays a central role, namely in Information Extraction and Graph Databases.

Information Extraction. Automata-based foundations of Information Extraction (e.g., [9, 16, 34]) have become a popular research topic over the last years. One framework that has been studied in this context is that of *document spanners* [16]. Document spanners model information extraction tasks as functions that map input text documents to a relation of *spans*, i.e., intervals of start and end positions in the text. A particular interesting class of spanners is the class of regular spanners, which is based on regular languages with capture variables. This class satisfies a number of interesting complexity and expressiveness properties and therefore caused a revival of automata- and formal language techniques in database research. Examples of such work are on the enumeration of answers [1, 18], expressiveness [20, 21, 33], complexity issues [22, 29, 32], integration of weights [15], and distributed evaluation [14]. That said, the document spanners framework is not the only one that is studied in this context, and there are other elegant frameworks that can express information extraction functions beyond the spanner framework, e.g., [9, 34].

Graph Databases. Formal languages have played a central role in Graph Databases since the SIGMOD 1987 paper of Cruz et al. [12], which is one of the first and most influential papers on the topic. Indeed, this paper introduced regular expressions for querying paths (later named *regular path queries* or *RPQs*), which are still used in graph query languages today [13, 19, 24]. This early work on Graph Databases only allowed RPQs to match *simple paths* in graphs, i.e., paths without repeated nodes. However, after discovering that this restriction already makes simple queries difficult to evaluate [30], it was largely abandoned by the research community, and a huge body of research on fundamental problems followed, in which RPQs were allowed to match all paths. This line of work is too extensive to discuss here, but its state until 2013 is nicely surveyed by Barceló [7]. It still produces high-quality and exciting results today (e.g., [8, 17]).

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Perhaps ironically, the *simple paths* and the similar *trail* restriction (which only allows paths without repeated edges) resurfaced on the systems side of graph databases. Indeed, an early incarnation¹ of SPARQL 1.1 [24] used (a variant of) the simple path restriction, whereas the default semantics of Cypher [13] uses the trail restriction. This new development on the practical side of graph query languages motivated several research groups to build a scientific basis that can be used to guide the design of RPQs in graph query languages [5, 6, 26, 27]. Furthermore, it seems that, in order to understand RPQ evaluation in practical graph query languages, it is very useful to combine fundamental research with query log analysis [10, 11, 28].

To conclude, it seems that the research communities' efforts to connect theory and practice (which go far beyond what I've been able to mention here, see, e.g. [2–4, 25, 31, 35]) are paying off, in the sense that we are now experiencing an increased interaction between researchers and practitioners in the *Graph Query Language (GQL) Standard* initiative [23] and the process that has led to it.² The GQL initiative was recently inaugurated as an official ISO project that aims at becoming an international standard for graph database querying. Furthermore, the story does not stop here at all—a large number of initiatives is currently brainstorming on next-generation logical foundations of graph databases and their query languages, schema languages for graphs, etc.

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¹ <https://www.w3.org/TR/2012/WD-sparql11-query-20120105>, see the definition of *ZeroOrMorePath*.

² <https://www.gqlstandards.org/existing-languages> has an influence diagram.

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