Elas4RDF: Multi-perspective Triple-centered Keyword Search over RDF using Elasticsearch

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Abstract. The task of accessing knowledge graphs through structured query languages like SPARQL is rather demanding for ordinary users. Consequently, there are various approaches that attempt to exploit the simpler and widely used keyword-based search paradigm, either by translating keyword queries to structured queries, or by adopting classical information retrieval (IR) techniques. This paper demonstrates `Elas4RDF`, a keyword search system over RDF that is based on `Elasticsearch`, an out-of-the-box document-centric IR system. `Elas4RDF` indexes and retrieves *triples* (instead of entities), and thus yields more refined and informative results, that can be viewed through different perspectives. In this paper we demonstrate the performance of the `Elas4RDF` system in queries of various types, and showcase the benefits from offering different perspectives for aggregating and visualising the search results.

1 Motivation and Novelty

The Web of Data contains thousands of RDF datasets available online, including cross-domain KBs (e.g., DBpedia and Wikidata), domain specific repositories (e.g., DrugBank and MarineTLO), as well as Markup data through schema.org (see [5] for a recent survey). These datasets are queried through complex structured query languages, like SPARQL. Faceted Search is a user-friendlier paradigm for interactive query formulation, however the systems that support it (see [7] for a survey) need a keyword search engine as an entry point to the information space. Consequently, and since plain users are acquainted with web search engines, an effective method for keyword search over RDF is indispensable.

At the same time we observe a widespread use of out-of-the-box IR systems (e.g., `Elasticsearch`) in different contexts. To this end we investigate how these, document-centric Information Retrieval Systems (IRSs), can be used for enabling keyword search over arbitrary RDF datasets. This endeavor raises various questions revolving around: (a) how to index an RDF dataset, (b) what to rank and how, and (c) how the search results should be presented.

This paper demonstrates `Elas4RDF`, a keyword search system over RDF that is based on the popular IR system `Elasticsearch`. Our main research question, as elaborated in the conference paper [4], was: *"Can Elasticsearch be configured*

to offer a retrieval performance comparable to that of dedicated keyword search systems for RDF?". Here, we describe and demonstrate a system that is based on that approach, that additionally focuses on the presentation / aggregation of the search results. Specifically, the retrieved RDF triples are displayed through various *perspectives* (each corresponding to a separate tab) that provide different presentations and visualisations of the search results and can satisfy different information needs. Since interaction is of prominent importance in information retrieval [1], we propose a perspectives' switching interaction that is familiar to all users (Web search engines offer various tabs for images, videos, news, etc).

The most relevant work to ours is the LOTUS system [3], a keyword search system over RDF data that is also based on `Elasticsearch`. However, its main focus is on scalability, while we focus on effectiveness (see [4]) and the support of various types of search through different views. With respect to user-friendly interfaces, there are systems focusing on particular aspects (e.g., faceted search). To the best of our knowledge though, there are no available prototypes that offer keyword access and multiple methods for inspecting the search results.

2 Indexing, Retrieval, and Evaluation

As detailed in the conference paper [4], we opt for high flexibility and thus consider *triple* as the retrieval unit. A triple is more informative than an entity. It can be viewed as the simplest representation of a fact that verifies the correctness of a piece of information for Q&A tasks. Furthermore, it offers flexibility on how to structure and present the final results, which is the focus of this work.

For *indexing*, we evaluated variations of two main approaches on what data to consider for each *virtual document* (triple in our case). The *baseline* approach considers only data from the triple itself (i.e., text extracted from the subject, object and predicate). The *extended* approach exploits information in the neighbourhood of the triple's resource elements, like one or more descriptive properties such as *rdfs:label* and *rdfs:comment*. Regarding the *retrieval process* we have experimented with various *query types*, *weighting methods* and *similarity models* that are offered by `Elasticsearch`.

We have *evaluated* the above using the DBpedia-Entity test collection[3], which is based on a DBpedia dump of 2015-10. The collection contains a set of heterogeneous keyword queries that cover four categories: i) named-entity queries (e.g., "Brooklyn bridge"), ii) IR-style keyword queries (e.g., "electronic music genre"), iii) natural language questions (e.g., "Who is the mayor of Berlin?"), and iv) entity-list queries (e.g., "professional sports teams in New York)". In total, over 49K query-entity pairs are labelled using a three-point scale; 0 for irrelevant, 1 for relevant, and 2 for highly relevant.

The key results from the evaluation are the following: i) all triple components contribute to the system's performance; ii) object keywords seem to be more important than subject keywords, thus giving higher weight to the object fields

[3] `https://iai-group.github.io/DBpedia-Entity/`

can improve performance; iii) extending the index with additional descriptive information about the triple URIs improves performance; however, including all available information (all outgoing properties) introduces noise and drops performance; iv) the default similarity model of `Elasticsearch` (BM25) performs satisfactory; v) using `Elasticsearch` for keyword search over RDF data is almost as effective as task- and dataset-oriented systems built from scratch. For more details the interested reader should refer to [4].

3 The `Elas4RDF` Search System

3.1 Indexing Service and Search REST API

For enabling the community and other interested parties to use our approach over arbitrary RDF datasets, we have made publicly available two dedicated `Elas4RDF` services.

Elas4RDF-index Service.[4] This service creates an index of an RDF dataset based on a given configuration (e.g., using the baseline/extended approaches described in [4]). The index can then be queried by the `Elas4RDF-search` service.

Elas4RDF-search Service.[5] This service exploits an `Elas4RDF-index` and initialises a REST API which accepts keyword queries and returns results in JSON format. Apart from the *query*, the list of parameters optionally includes: i) the *size* of the answer, ii) the name of the *index* to consider (from `Elas4RDF-index`), iii) the *type* of the answer (triples, entities, both), iv) the index *field* over which to evaluate the query (e.g., only over the subject), and v) a *body* parameter through which one can express a complicated DSL query.[6]

The `Elas4RDF-search` service is used by the `Elas4RDF` search system for retrieving the results of a keyword query and presenting them to the user through different visualisation methods (more details below). One can easily configure it to use the search service over another dataset. A demo of the `Elas4RDF` system over DBpedia is available at: `https://demos.isl.ics.forth.gr/elas4rdf/`

3.2 Multi-Perspective Presentation of Search Results

The presentation and visualisation of RDF data is challenging due to the complex, interlinked, and multi-dimensional nature of this type of data [2]. An established method on how to present RDF results for arbitrary query types does not exist yet, and it seems that a single approach cannot suit all possible requirements.

A core design characteristic of `Elas4RDF` is that the retrieval unit is *triples*. This decision enables us to offer a *multi-perspective* approach, by providing different methods to organise and present the retrieved relevant triples. Specifically,

[4] `https://github.com/SemanticAccessAndRetrieval/Elas4RDF-index`
[5] `https://github.com/SemanticAccessAndRetrieval/Elas4RDF-search`
[6] `https://www.elastic.co/guide/en/elasticsearch/reference/current/query-dsl.html`

multiple perspectives, each presented as a separate *tab*, are used for the presentation of the keyword search results, where each one stresses a different aspect of the hits. The user can easily inspect all tabs and get a better overview and understanding of the search results. Figure 1 shows the search results for the query "`El Greco paintings`", as presented in each of the four currently-supported perspectives. Below, we give more details for each perspective/tab.

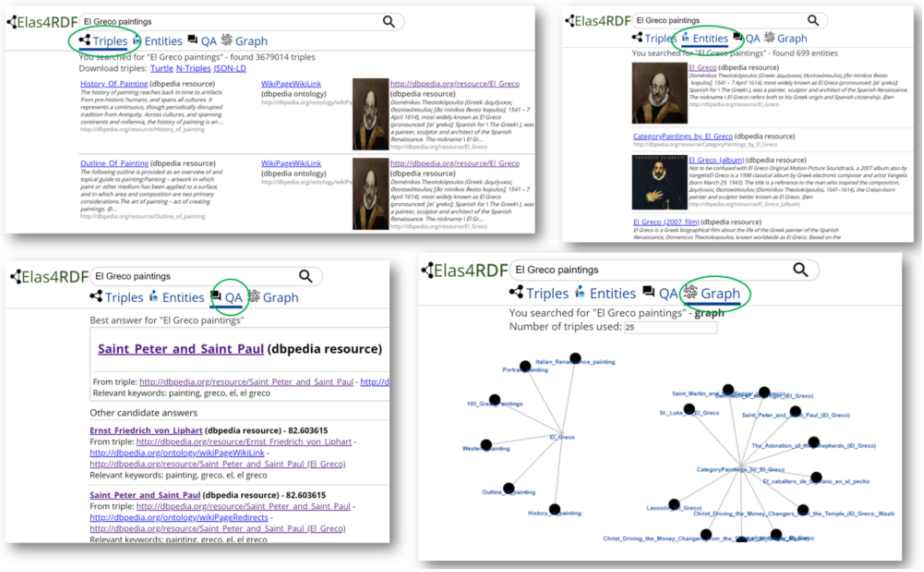

Fig. 1. Search results for the query "El Greco paintings".

Triples Tab. A ranked list of triples is displayed to the user, where each triple is shown in a different row. For visualising a triple, we create a *snippet* for each triple component (subject, predicate, object). The snippet is composed of: i) a title (the text indexed by the baseline method), ii) a description (the text indexed by the extended index; if any), and iii) the URI of the resource (if the element is a resource). If the triple component is a resource, its title is displayed as a hyperlink, allowing the user to further explore it. We also retrieve and show an image of the corresponding entity (if any), which is usually provided in cross-domain knowledge bases like DBpedia and Wikidata.

Entities Tab. Here the retrieved triples are *grouped* based on entities (subject and object URIs), and the entities are *ranked* following the approach described in [4], which considers the discounted gain factor of the ranking order of the triples in which the entities appear. Then, a ranked list of entities is displayed to the user, where each entity is shown in a different row. For visualising an entity, we create the same snippet like previously. The title is displayed as a hyperlink, since the entities are resources, allowing the user to further explore the entity.

Graphs Tab. Here the retrieved triples are visualised as a graph enabling the user to see how the 15 top-ranked triples *are connected*, however the user can increase or reduce this number. Moreover, the nodes that correspond to resources are clickable, pointing to the corresponding DBpedia pages. The current implementation uses the JavaScript InfoVis Toolkit[7].

Question Answering (QA) Tab. Here we attempt to interpret the user's query as a question and provide a *single compact answer*. The challenge is to retrieve the most relevant triple(s) and then extract natural language answers from them. QA over structured data is a challenging problem in general and currently only a few kinds of questions are supported by this "under-development" tab. It returns the more probable answer accompanied by a score, plus a list of other possible answers. In our running example, this tab returns the title of one painting of El Greco, while for the query "`Who developed Skype?`" it returns as more probable answer "`Microsoft`" and the next possible answer is "`Skype Technologies`".

4 Demonstration Scenarios

We will showcase the functionality of the system through queries of various kinds, like "`fletcher bounty`", "`drugs containing aloe`", "`Which cities does the Weser flow through?`", "`Rivers of Greece`". Below we briefly discuss the added value that each perspective brings for the indicative query $q =$ `Crete and Mars` (as it involves more than two entities, and words with different meanings).

• **Triple's Tab**: This tab is generally the most useful one since the user can inspect all components of each triple, and understand the *reason why* that triple is returned. The addition of images helps to easily understand which triples involve the same entities. For the query q the user gets more than 600K triples that involve the name Crete (island) and Mars (mythical god, planet, etc.).

• **Entities' Tab**: If the user is interested in *entities*, and not in particular facts, this view provides the main entities. For the query q the returned entities include the island of Crete, an area of Mars whose name is related to Crete, Administration Area of Crete, Battle of Crete, and others.

• **Graph's Tab**: This tab allows the user to inspect a large number of triples without having to scroll down. Moreover this view reveals the *grouping* of triples, and whether there is one or more poles and interesting insights. For example, for the query q the user can see the connection of Crete (island) with Mars (mythology), through a resource about the Battle of Crete: Mars was the mythical codename of a group of the Operation Mercury (Nazi's invasion to Crete in WWII).

• **Q&A Tab**: The result of this view for the query q is "Icaria Planum" which is a region on Mars whose name is based on the land where Icarus lived (Crete). This is what the current implementation of QA estimated as the more probable compact answer that connects Crete and Mars. In this particular query, this

[7] `https://philogb.github.io/jit/`

answer corresponds to the top ranked entity, however for other queries this is not the case: for the query "Tesla birth place" the entities' tab return first the resource about Nikola Tesla, while the QA tab returns "Obrenovac" which is the area where the largest Serbian thermal power plant "TPP Nikola Tesla" is located. The correct birth place of Nicola Tesla (Smiljan, Croatia) is shown in the first page of results.

5 Closing Remarks

`Elas4RDF` is a triple-centric keyword search system over RDF data. It can be applied to a plethora of RDF datasets since it is schema agnostic, it can be configured easily, and "inherits" the maturity and scalability features of `Elasticsearch`. The multi-perspective presentation of the search results enables tackling various kinds of information needs and allows users to explore the information space through the prisms of triple, entities, graph and Q&A tabs.

More perspectives will be added in the near future, e.g. for supporting *Faceted Search* as well as the formulation of SPARQL queries for advanced users. We also plan to advance the QA perspective for recognising the query type, enabling in this way the prioritisation of the perspectives, and to test the system over the domain specific knowledge repositories of GRSF [8] and ClaimsKG [6].

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