

An Event-based Approach for Querying Graph-Structured Data Using Natural Language



GraphQ 2014

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Natural-Language Interfaces to triplestores

Translate NL to SPARQL – Problem 1

“Who married Al Capone in 1918?” prepositional phrase

↓ translation

SPARQL QUERY

↕ SPARQL endpoint

```
<http://dbpedia.org/resource#Al_Capone>  
  <http://dbpedia.org/ontology/spouse  
    <http://dbpedia.org/resource#Mae_Capone> .
```

How do we add the data representing the prepositional phrase?

```
<...Al_Capone> <year_married> <...1918> .  
Not adequate as Capone could have married twice.
```

ANSWER: Use some version of reification
BUT complicates translation from NL to SPARQL

Natural-Language Interfaces to triplestores

Translate NL to SPARQL – Problem 2

“Who joined every gang that was joined by Torrio and stole a car in 1918 or 1920 in a borough of New York?”



SPARQL QUERY

Too complicated – chained complex prepositional phrases with arbitrarily-nested quantifiers?

We are unaware of any system that can do this.

ANSWER: Do not use SPARQL

Evaluate the NL queries directly w.r.t. the triplestore

A Solution to Problem 1

Event-Based Triplestores – a form of reification

```
[("event1000", "type", "born_ev"), ("event1005", "type", "smoke_event"),
 ("event1000", "subject", "capone"), ("event1006", "type", "membership"),
 ("event1000", "year", "1899"), ("event1006", "subject", "car_1"),
 ("event1000", "location", "brooklyn"), ("event1006", "object", "car"),
 ("event1001", "type", "join_ev"), ("event1007", "type", "membership"),
 ("event1001", "subject", "capone"), ("event1007", "subject", "fpg"),
 ("event1001", "object", "fpg"), ("event1007", "object", "gang"),
 ("event1002", "year", "1908" ), ("event1005", "subject", "capone"),
 ("event1004", "type", "steal_ev"), ("event1010", "subject", "capone"),
 ("event1004", "subject", "capone"), ("event1010", "object", "person"),
 ("event1004", "object", "car_1"), ("event1010", "type", "membership"),
 ("event1004", "year", "1908"), ("event1011", "subject", "torrio"),
 ("event1004", "location", "brooklyn"), etc.]
```

Solution to Problem 2

Direct Evaluation of NL Queries w.r.t. Triplestore

“Who stole a car in 1918 or 1920 in a borough of New York?”

↓ parser ↓

“Who (stole (a car) [(in (1918 or 1920), in (a (borough (located_in New_York))))])?”

↓ ↓ ↓ ↓ ↓ ↓ ↓ ↓ ↓ ↓ ↓ ↓ ↓ ↓

$\lambda... (\lambda... (\lambda... \lambda...) [(\lambda... (\lambda... \lambda... \lambda...), \lambda... (\lambda... (\lambda... (\lambda... \lambda...)))])))$

↑ ↑ ↑ ↑

TRIPLESTORE

Where $\lambda...$ are functions (which are the denotations of English words)
 based on an efficient version of Montague semantics

Some functions are defined in terms of triplestore retrieval operations: ↑

Basic Triplestore Retrieval Functions

getts_1 (ANY, REL "subject", ENT "capone")

=> {(1000, REL "subject", ENT "capone"),
(1001, REL "subject", ENT "capone"), etc.

getts_3 similar.

getts_1 and getts_3 are used to define other basic retrieval operators.

Defs in the paper..

Example uses of other retrieval operators:

get_subjs_for_events {EV 1000, EV 1009} => {ENT "capone", ENT "torrio"}

get_members "thief_set" => {ENT "capone"}

get_subjs_of_event_type "born_ev" => {ENT "capone"}

We can now define semantics using these basic operators

Definitions of the denotations of Words

We use the notation of set theory in place of lambda expressions

thief = get_members "thief_set"

e.g. **thief** => {ENT "capone"}

smokes = get_subjs_of_event_type "smoke_ev"

e.g. **smokes** => {ENT "capone"}

capone setofents = (ENT "capone") ∈ setofents

e.g. **capone** **smokes** => True

a **nph** **vbph** = #(**nph** ∩ **vbph**) ≈ 0

term_and **tmph1** **tmph2** = f where

f setofevs = (tmph1 setofevs) & (tmph2 setofevs)

e.g. **((a thief) \$term_and capone) smokes** => True

Our new semantics – major contribution 1

An explicit definition of the denotation of transitive verbs

$\text{join } \text{tmph}$
 $= \{ \text{subj} \mid (\text{subj}, \text{evs}) \in (\text{make_image } \text{join_event})$
 $\quad \&$
 $\quad \text{tmph} (\cup \{ \text{map thirds (getts (ev, REL "object", ANY))} \mid \text{ev} \in \text{evs} \}) \}$

where, for example: $\text{make_image } \text{"join_ev"}$
 $\Rightarrow \{ (\text{ENT "capone"}, \{ \text{EV 1001}, \text{EV 1003} \}), (\text{ENT "torrio"}, \{ \text{EV 1009} \}) \}$

e.g. $\text{join (a gang)} \Rightarrow \{ \text{ENT "capone"}, \text{ENT "torrio"} \}$

Major contribution 2: Prepositional phrases

Simplified example – a single **prepositional phrase**

steal_with_time tmph **date**

$$= \{ \text{subj} \mid (\text{subj}, \text{evs}) \in \text{image_steal} \ \& \\ \text{tmph} (\cup \{ \text{thirds} (\text{getts} (\text{ev}, \text{REL} "object", \text{ANY})) \\ \mid \text{ev} \in \text{evs} \\ \& \\ \text{date} (\text{thirds} (\text{getts} (\text{ev}, \text{REL} "date", \text{ANY})))) \}) \}$$

The date argument is used to “filter” the events.

e.g. **steal_with_time (a car) (date_1918) => {ENT "capone"}**

The result: A wide range of English NL queries

We have implemented simple case of prepositional phrases in Haskell – with an in-program triplestore.

e.g. “Which gangster who stole a car in 1915 or 1918 joined a gang that was joined by Torrio?”

↓ manual insertion of brackets

**which (gangster \$that (steal_with_time (a car)
(date_1915 \$term_or date_1908))
(join (a (gang \$that (joined_by torrio))))**

↓

{ENT “capone”}

Next steps

1. Extend implementation to include **chained** prepositional phrases such as: “**who stole a car in Brooklyn in 1908 or 1915**” (our solution is briefly described in the paper) **(have done this)**

2. Deploy our triples on the semantic web and access them through a SPARQL endpoint using the basic retrieval operators (which only use basic SPARQL SELECT operations) **(have done this)**

```
SELECT ?first WHERE {?first, <given_second>, <given-third>} .  
SELECT ?third WHERE {<given_first>, <given_second>, ?third} .
```

3. Integrate the semantics with our X-SAIGA NL parser. **(have nearly completed this)**

4. Interface our query processor with our speech browser. **(have nearly completed this)**



An NL speech query interface to semantic web data

References to our previous work

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Acknowledgements

Rahmatullah Hafiz

Paul Callaghan

Nabil Abdullah

Ali Karaki

Paul Meyer

Matthew Clifford

Shane Peelar

Stephen Karamatos

Walid Mnaymneh

Rob Mavrinac

Cai Filiault

NSERC – Natural Science and Engineering Council of Canada

Research Services - University of Windsor