

# Question Answering on Statistical Linked Data

AKSW Colloquium paper presentation

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## 1 Introduction

## 2 Corpus & Benchmark

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# Motivation

## Statistical Linked Data

- Increasing amounts available
- Highly relevant for decision making

## Problems

- Multidimension data opaque to the end user
- Reliance on predefined visualizations: problems of bias, coverage, adequacy

# Motivation

## Question Answering

- Intuitive and expressive way of accessing Linked Data
- Generic algorithms cannot process statistical Linked Data
- Specific algorithms for statistical Linked Data do not exist

# Contributions

- Corpus of natural language questions with statistical information needs
- Benchmark based on the corpus
- First QA algorithm for statistical RDF data
- First results and discussion of challenges to open up statistical QA as new research field

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# Corpus

- High precision requires analysis of typical user questions
- Open survey where participants were asked to provide question with statistical information needs
- 50 questions to no particular existing dataset

# Corpus

## Excerpt of Questions

How much money, does Leipzig and Dresden spend on child care in relation to the birth rate in comparison to the average in Saxony.

What is the average monthly income of a German citizen?

How much money was invested to fight bicycle thefts in Leipzig?

How many citizens live in a certain area?

How much does Germany spend on research a year?



# Corpus Properties

restriction	dimension value	29
	dimension value range	5
	measure value range	2
	top k measure	5
	top k dimension	1
expected answer type	measure value	14
	measure value aggregate	10
	dimension count	2
	dimension value	7
referenced	measure name	30
	measure unit	2
	dimension name	3

# Benchmark

- Subset of the corpus that has an identifiable correct interpretation
- Rewrite to one specific dataset: LinkedSpending Finland foreign aid<sup>1</sup>

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<sup>1</sup><http://linkedspending.aksw.org>

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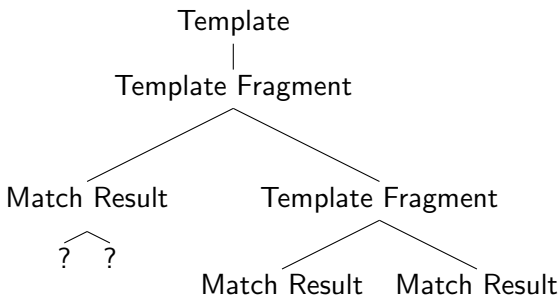
3 Algorithm

# Observations and Assumptions

- Questions are structurally complex but semantically simple
- All answerable questions ask for a subset of a data cube (optionally + an aggregate)
- Query model as conjunction, empty question selects everything, phrases are restrictions on dimension values → doesn't model all questions but many and leads to efficient implementation

# TCQA—Tree Based Question Answering

- Recursive visit of parse tree
- Stanford statistical english parser resulting in phrase structure
- adaptable to other languages
- Top-down matching, bottom-up combining



## Match Result

- $m = (N, V)$
- $N$ —scored component property (name) references  
 $R \subseteq P \times [0, 1]$
- $V$ —scored comp. property value references  
 $V \subseteq P \times L \cup U \times [0, 1]$
- $P$ —component properties
- $L$ —literals
- $U$ —uris

## Combining Match Results to Template Fragment

- Fragment  $c(m_1, m_2) = (N, V, R)$
- $R \subseteq P \times V \times V$  (restriction is property with value range)
- $N$  and  $V$  are unions of  $N$  and  $V$  from  $m_1$  and  $m_2$  minus property references and values in the restriction
- $R$  at most one element: combination of property reference and fitting property value between both match results with highest score product
- Combining template fragments works in the same way but existing restrictions are integrated as well

## Converting Template Fragment to Template, Execution

- Leftover property value references for unmatched properties over a threshold are converted to restrictions
- All other references are discarded, the set of restrictions (+ aggregate) is the template
- Restrictions in template are transformed to a SPARQL query
- Query execution  $\rightarrow$  answer



# Evaluation

Criterion	$\emptyset p$	$\emptyset r$	$\#p = 1$	$\#r = 1$
all component properties	68.12%	38.04%	10	0
dimensions	70.37%	64.81%	8	9
attributes	0%	0%	0	0
measures	72.72%	63.63%	8	6
restrictions	46.15%	30.77%	6	2

# CubeQA needs you

- new research sub-area, many “low hanging fruits” still available
- highly significant but very low manpower
- danger of big companies with high manpower coming in and overtaking it
- ideal for new PhD students or intermediate ones who want to specialize in QA but are not sure in which sub area yet

## How you can contribute: Research

Write paper about RDCQA, no survey yet but either:

- see [https://svn.aksw.org/papers/2016/ISWC\\_cubeqa/public.pdf](https://svn.aksw.org/papers/2016/ISWC_cubeqa/public.pdf)
- implement full system, benchmark with QALD6T3-test or
- implement a single component, integrate in CubeQA and benchmark or
- improve CubeQA: <https://github.com/AKSW/cubeqa>
- adapt a single component from existing SQA system to RDCQA or
- theoretically examine aspect of RDCQA or
- collect large real-world question corpus

# How you can contribute: Research Project Proposal

Join our research proposal:

- <https://docs.google.com/document/d/1u-RVZfIVqrSsat5jpfjqSFR3jEPQzv0EznMjIT-EI>
- RDCQA infrastructure on statistical business operation data
- transform business operation data to Linked Data
- develop framework to aid company deciders to make better decisions
- if it gets accepted we may have funding for positions
- we need German and non-German companies: tell us about companies that fit