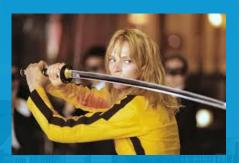
# Knowledge Graphs have unfinished business...





@AxelPolleres

http://polleres.net/presentations



EC







### **Panel Questions - Short answers:**

#### • What are the problems of current KG approaches?

Knowledge Graphs have unfinished business...
i.e., we can't just go along, without solving some core problems
(that don't go away by rebranding Semantic Web and Linked Data)!

## • What are your visions or thoughts about KG applications in academia and industry

Decentralised Data Eco-Systems beyond centralised KGs!

#### What are the future directions for KG

Natural **Data** Understanding, i.e. "NoNLP"! Contextualisation ... still ;-) Scalable Linked Data Processing... now for real!

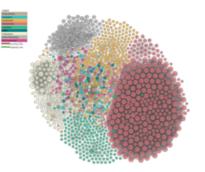
## **Knowledge Graphs have unfinished business...**



... with *Linked Open Data* 

more specifically, with **BOTH** 

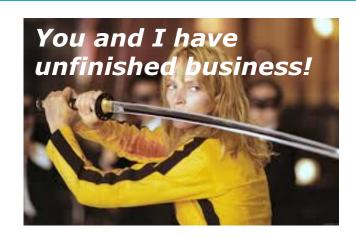
Linked Data



AND

Open Data

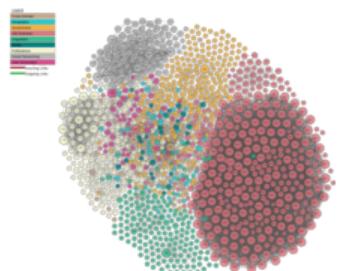




#### **Knowledge Graphs and Linked Data**



Beyond Dbpedia and Wikidata... we had the vision of a **Web of Open KGs** that would be *interlinked* and *queryable* 



Did it produce more than this lovely picture?

Yet: we are left with tons of issues [1]!

... e.g. linkage between KGs still sparse [2], but also others, e.g. availability & sustainability (beyond a PhD lifetime) of Open KGs!

[1] Axel Polleres, Maulik Rajendra Kamdar, Javier D. Fernández, Tania Tudorache, and Mark A. Musen. A more decentralized vision for linked data. 11(1):101--113, January 2020. SWJ 10-years special issue. [http] [2] Armin Haller, Javier D. Fernández, Maulik R. Kamdar, and Axel Polleres. What are links in linked open data? a characterization and evaluation of links between knowledge graphs on the web. ACM Journal of Data and Information Quality (JDIQ), to appear, Pre-print available https://epub.wu.ac.at/7193/.

#### **Knowledge Graphs and Open Data**



Open Data had a boost some years ago and is still trending, esp. for Government Data & Transparency!

Yet: hardly any of this data is linked/linkable or even findable!



#### **Knowledge Graphs and Open Data**

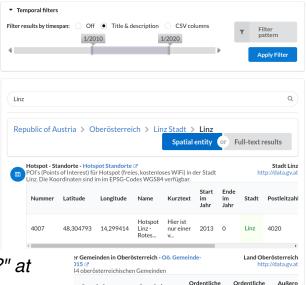


Open Data had a boost some years ago and is still trending, esp. for Government Data & Transparency!

Yet: hardy any of this data is linked/linkable or even findable!

- (Open) Knowledge Graphs can be used to link Open Data!
  - challenges: Coverage, numeric data, OD Quality/KG Quality

Keynote "How do Linked Data, Open Data, and Knowledge Graphs interplay?" at DEXA 2019, August 2019, Linz, Austria. polleres.net/presentations/20190827DEXA keynote.pdf



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# What are your vision or thoughts about KG applications in academia and industry



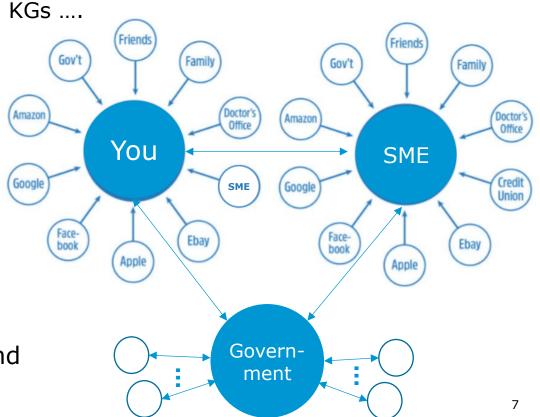
We need to build on our strength!

Rather than (more) centralised KGs ....

- Make a **Decentralised** Data Eco-Systems work!
- enable trusted data sharing
- enable FAIR principles

Applications galore!

e.g.: bring together personal data spaces and industrial data spaces!



What are the future directions for KG 1/3

#### **Towards "Natural Data Understanding"**

"Natural Data" = "Structured Data as it occurs in the wild"

- Heterogenous data assets
- From different sources and origins
- Different Formats

numerical values. (ISWC2016)

- Different Semantics
- Sparse descriptive metadata
- Raw/not necessarily for human consumption
- → (**Still**) Hard to search and integrate!

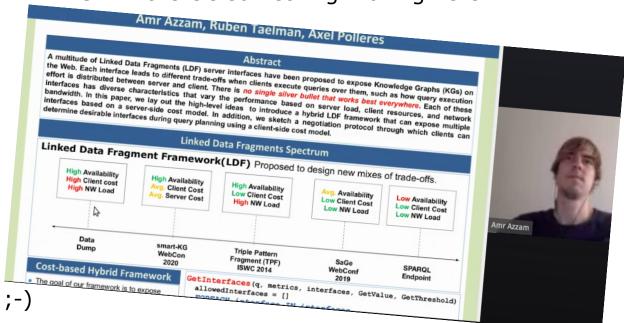
[3] Sebastian Neumaier and Axel Polleres. Enabling spatio-temporal search in open data. *Journal of Web Semantics* (JWS), 55, March 2019.
[4] Sebastian Neumaier, Jürgen Umbrich, Josiane Parreira, and Axel Polleres. Multi-level semantic labelling of

NUTS

## What are the future directions for KG 2/3



- Scalable Linked Data Processing... now for real!
  - (SPARQL EP, TPF, SMART-KG --> there's something moving here!



- Contextualisation ... still ;-)
  - next step: Represent and query at scale contextualised KGs
    - Provenance, Policy-constrained Graphs/Triples, Property Graphs, SPARQL\*

#### What are the future directions for KG 3/3



• Managing context makes things even harder! → but is also doable!

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#### **Take-home summary**



if I could predict the future, I wouldn't be here...

... rather an invitation (especially to young researchers):

p.s.: Don't **only** work on DL, I know you do anyway, there's plenty of other stuff to do ;-)

There's still a lot of unfinished business and unfuilfilled promises from Semantic Web, Linked Data, etc. that (despite "rebranding" into KGs)

- haven't been solved
- should and could be solved/tackled with more research!

Let's do this together!

<u>https://www.cost.eu/cost-action/distributed-knowledge-graphs/</u> COST Action https://knowgraphs.eu/ ITN