

UNIVERSITÄT **WIEN** VIENNA ECONOMICS AND BUSINESS



## **On Archiving Linked and Open Data**

**Axel Polleres** (with a lot of input by Javier Fernandez & Jürgen Umbrich ;-))

30.05.2016 - 2nd Workshop on Managing the Evolution and Preservation of the Data Web, MEPDaW@ESWC16

### What we will talk about...

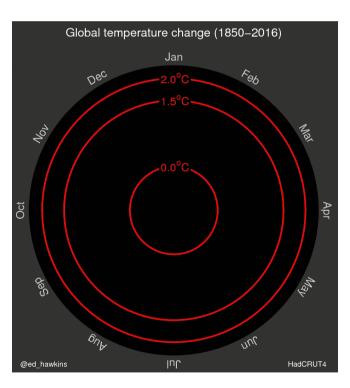


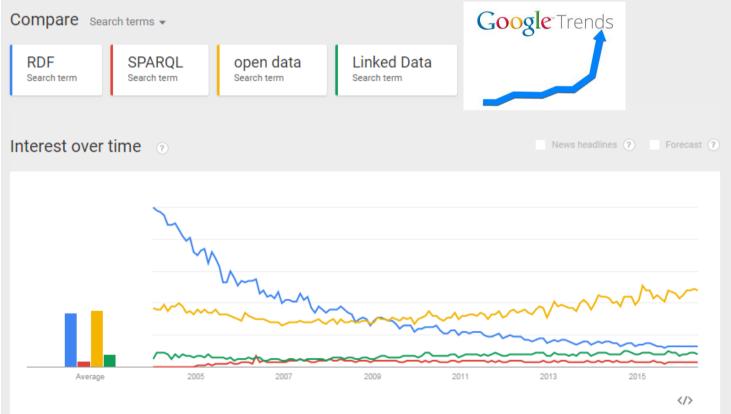
- Monitoring Evolution and Archiving ... why is it important? Some examples...
- General Challenges of Archiving the Web of Data
- Some challenges more in-depth
- Discussion... (hopefully © )

#### Why evolution matters (Creationists: please ignore this slide...)



#### Monitoring evolution is relevant





#### **Evolution matters**

- Changes tell us "something"
  - Uncertain information
  - Validity of the information

#### Donald Trump: Difference between revisions

#### From Wikipedia, the free encyclopedia

Line 246:

[File:Donald ]	Trump by	Gage Skidmore	3.jpg left thumb 1	Trump speaking	at the 2015 [[	Conservative F	Political Action (	Conference]] (	CPAC) in [[Nati	onal Harbor,
/laryland]]]]										

In April 2011, Trump questioned President [[Barack Obama]]'s [[Barack Obama citizenship conspiracy theories|proof of citizenship]],</te> {{cite news |title=Trump goes after Obama on US citizenship, says citizenship guestions remain unanswered |date=April 7, 2011 |agency=[[Associated Press]] [work=[[The Washington Post]]]}</ref> alleging that, "His grandmother in Kenya said he was born in Kenya and she was there and witnessed the birth, okay?"<ref name=Farley>Farley, Robert. [http://www.politifact.com/truth-o-meter/statements/2011/apr/07/donald-trump/donald-trump-says-president-obamas-grandmothercau/ "Donald Trump Says President Obama's grandmother caught on tape saying she witnessed his birth in Kenya"], "[[Politifact]]" (April 7, 2011): "What we heard was a very rough translation in which an elderly woman agreed to the leading question that Obama was born in Kenya and that she was present. But it was immediately and clearly corrected -- repeatedly."</ref name=McGraw7Apr>{{cite news |url=http://www.today.com/id/42469703/ns/today-today people/ ltitle=Trump: I have 'real doubts' Obama was born in U.S. |work=Today |first=Seamus |last=McGraw |date=April 7, 2011 |accessdate=September 13, 2015}}/</ref Trump's claim derived from an incomplete transcript of a telephone interview with Obama's grandmother, provided by Obama's opponents.<ref name=Farley /><ref name=Factcheck2011Apr /> Trump also questioned whether Obama had good enough grades to warrant entry to Harvard Law School.<ref>Madison, Lisa (April 26, 2011).[http://www.cbsnews.com/news/trump-how-did-obama-get-into-the-ivy-league/ Trump: How did Obama get into the lvy League?]. CBS News.</ref> said to have sent a team of private investigators to [[Hawaii]], Obama's documented birthplace,<ref name=Factcheck2011Apr>{{cite news |url=http://www.factcheck.org/2011/04/donald-youre-fired/ |title=Donald, You're Fired! Trump repeats false claims about Obama's birthplace. [publisher=Factcheck.org |date=April 9, 2011 |accessdate=September 13, 2015}]</ref> and told "[[Today (U.S. TV program)|The Today Show]]" "they cannot believe what they're finding."<ref name=Elliott8Apr>{{cite news |url=http://www.salon.com/2011/04/08/trump\_hawaii\_investigators/ |title=Did Trump really send investigators to Hawaii? |date=April 8, 2011 |accessdate=September 13, 2015 |first=Justin |last=Elliott |work=Salon} 2011. Trump called for Obama to end the citizenship issue by releasing the long form of his birth certificate.

|url=http://ac360.blogs.cnn.com/2011/04/25/trump-claims-obama-birth-certificate-missing/ |title=Trump claims Obama birth certificate 'missing' |date=April 25, 2011

#### Donald Trump: Revision history (?) Help View logs for this page - Browse histon From year (and earlier): 2016 From month (and earlier); all • Tag filter Show For any version listed below, click on its date to view it. For more help, see Help:Page history and Help:Edit summary External tools: Revision history statistics & Revision history search & Edits by user & Number of watchers & Page view statistics (cur) = difference from current version. (prev) = difference from preceding version. $\mathbf{m} = \text{minor edit.} \rightarrow = \text{section edit.} \leftarrow = \text{automatic edit summary}$ (newest Loldest) View (newer 50 Lolder 50) (20 L50 L100 L250 L500) Compare selected revisions (cur | prev) (01:45, 25 May 2016 Anythingyouwant (talk | contribs) ... (282,961 bytes) (+27) ... (→Early life: clarify who was Frederick and who • (cur | prev) 00:32, 25 May 2016 Anythingyouwant (talk | contribs) ... (282,934 bytes) (-27) ... (per talk page, unclustering huge clusters of hidden footnotes; (cur | prev) 00:27, 25 May 2016 BarrelProof (talk | contribs) . . (282.961 bytes) (+57) . . (→Reliaious views: Younger than what?) • (cur | prev) 00:06, 25 May 2016 AnomieBOT (talk | contribs) . . (282,904 bytes) (+549) . . (Rescuing orphaned refs ("msnbc1" from rev 721935275; "CBC\_August29\_2015" from rev 7210352750 (cur | prev) 23:36, 24 May 2016 Anythingyouwant (talk | contribs) ... (282,355 bytes) (+1) ... (-Controversial immigration policies: spelling, merge two pararaphs • (cur | prev) 23:35, 24 May 2016 Anythingyouwant (taik | contribs) ... (282:354 bytes) (-661) ... (->Controversial immigration policies: swap hidden cluster of footnotes for two footnotes from main article on political positions, paraphrase accordingly) • (cur | prev) 🔍 23:19, 24 May 2016 Anythingyouwant (talk | contribs) . . (283,015 bytes) (-2) . . 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[http://www.politifact.com/truth-o-meter/statements/2011/apr/07/donald-trump/donald-trump-says-president-obamas-grandmothercau/ "Donald Trump Says President Obama's grandmother caught on tape saying she witnessed his birth in Kenya"], "[[Politifact]]" (April 7, 2011): "What we heard was a very rough translation in which an elderly woman agreed to the leading guestion that Obama was born in Kenya and that she was present. But it was immediately and clearly corrected -- repeatedly."</ref name=McGraw7Apr>{{cite news |url=http://www.today.com/id/42469703/ns/today-today people/ ltitle=Trump: | have 'real doubts' Obama was born in U.S. |work=Today |first=Seamus |last=McGraw |date=April 7. 2011 |accessdate=September 13. 2015}}</ref> Trump's claim derived from an incomplete transcript of a telephone interview with Obama's grandmother, provided by Obama's opponents <br/> <br/>cref name=Farley /><ref name=Factcheck2011Apr /> Trump also guestioned whether Obama had good enough grades to warrant entry to Harvard Law School.<ref>Madison, Lisa (April 26, 2011).[http://www.cbsnews.com/news/trump-how-did-obama-get-into-the-ivy-league/ Trump: How did Obama get into the Ivy League?]. CBS News.</ref> 25, 2011. Trump called for Obama to end the citizenship issue by releasing the long form of his birth certificate.<ref>{{cite news |url=http://ac360.blogs.cnn.com/2011/04/25/trump-claims-obama-birth-certificate-missing/ |title=Trump claims Obama birth certificate 'missing' |date=April 25, 2011 |publisher=CNN |accessdate=May 14, 2011}}</ref><ref>{{cite news |title=Birtherism: Where It All Began + |url=http://www.politico.com/news/stories/0411/53563\_Page3.html |work=[[Politico]] |date=April 22, 2011 |accessdate=April 25, 2011}}-(ref> Two days later, Obama made a formal statement in efforts by the [[White House]] to put the matter to rest with the release of the long form.<ref> [http://www.huffingtonpost.com/2011/04/27/obama-birth-certificate-r\_n\_854248.html Obama Birth Certificate Released By White House (PHOTO)]."[[The Huffington

issing' [date=April 25, 2011 Post]]" April 27, 2011. Retrieved May 8, 2011.</ref> Trump expressed pride at his role in the certificate's release in a press conference follow-up, saying he hoped it

4 ARCHIVING LINKED AND OPEN DATA

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## **Evolution matters**

- Evolution may reveal actions vs. consequences
  - E.g. CityDataPipeline, <u>http://citydata.wu.ac.at/</u>
    - Collecting, Integrating and Predicting Open City Data

European Green City Index | The result



	Crawler
Wrapper components	CSV RDF HTML RTF XLS GML OSM
Semantic Integration	Integration Component City Data Model
Data Storage	RDF Triple Store RDFS Reasoner SPARQL Engine GIS Database
Analytics	Aggregation Interpolation Clustering
UI & API	Web UI REST API Map UI



#### SIEMENS

#### Vienna ◀ Environment

#### Accumulated ozone concentration

- 1992: 6112.40 microgram per m3 (from <u>http://epp.eurostat.ec.europa.eu/</u>)
- 1994: 5998.80 microgram per m3 (from <u>http://epp.eurostat.ec.europa.eu/</u>)
- 1995: 5513.80 microgram per m3 (from <u>http://epp.eurostat.ec.europa.eu/</u>)
- 1997: 5181.80 microgram per m3 (from <u>http://epp.eurostat.ec.europa.eu/</u>)
- 1998: 5785.40 microgram per m3 (from <u>http://epp.eurostat.ec.europa.eu/</u>)
- 1999: 5141.60 microgram per m3 (from <u>http://epp.eurostat.ec.europa.eu/</u>)
- 2000: 6711.00 microgram per m3 (from <u>http://epp.eurostat.ec.europa.eu/</u>)
- 2001: 4940.40 microgram per m3 (from <u>http://epp.eurostat.ec.europa.eu/</u>)
- 2002: 5943.20 microgram per m3 (from <u>http://epp.eurostat.ec.europa.eu/</u>)
- 2003: 7939.40 microgram per m3 (from <u>http://epp.eurostat.ec.europa.eu/</u>)
- 2004: 4755.60 microgram per m3 (from <u>http://epp.eurostat.ec.europa.eu/</u>)
- 2005: 5585.00 microgram per m3

#### **Preservation matters**

 Web archives: Common Crawl, Internet Memory, Internet Archive, ...

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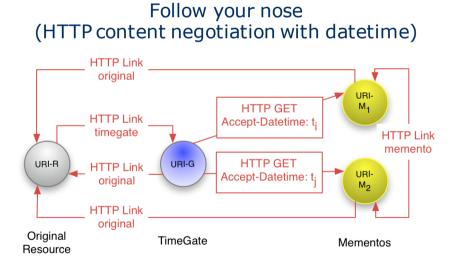
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Fail to Replicate?

Fall to Replicate? PrJATTATTATTATTA Because its hard to recreate the exact conditions of the original research. • The Real Trump Effect' for Neuron Latence

## **Time-based access matters**



The Memento protocol RFC 7089

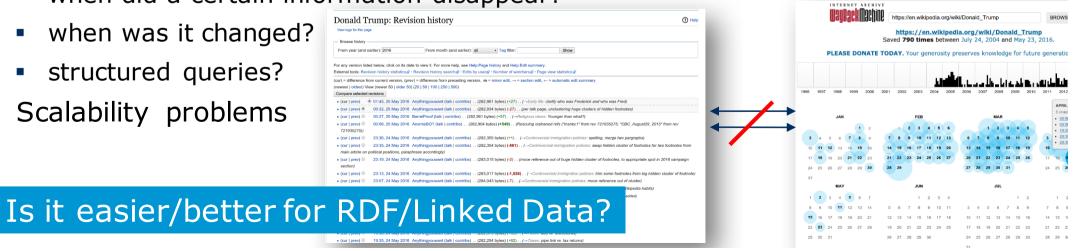


#### Batch discovery (list of URIs of Mementos of the Original Resource) HTTP Link HTTP Link HTTP Link timemap timegate timemap URI-G URI-R URI-T URI-M Original TimeGate TimeMap Memento Resource

#### But...

## **Challenges**

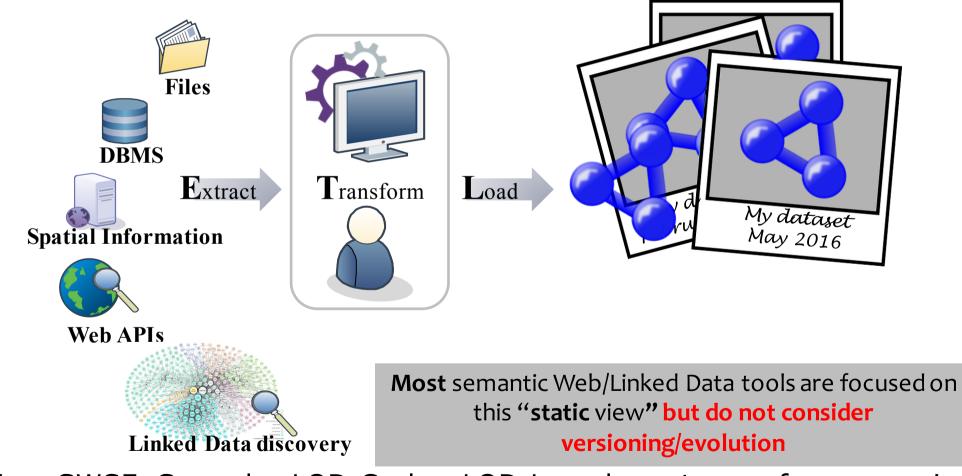
- Poor **granularity** ("some" snapshots)
- **Aggregated** data, only, rather than raw data access
  - (e.g. in Google trends)
- Few work on archiving the **Web of Data**, or on integrating archives
- What is the right **query language**?
  - basic retrieval features (get version at timestamp t)
  - when did a certain information disappear?
  - when was it changed?
  - structured queries?
- Scalability problems



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## Linked Data Archives: The missing link in the RDF evolution

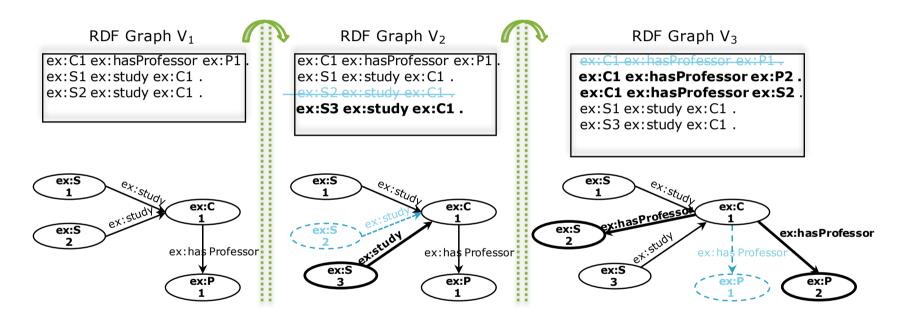


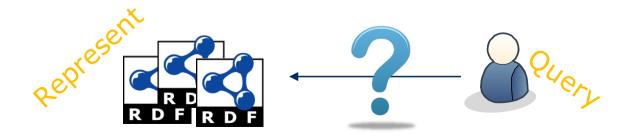


Sindice, SWSE, Swoogle, LOD Cache, LOD-Laundromat... so far, no versions!

## **RDF Archiving. Example**







## One of the first real LOD use cases: The Dynamic Linked Data Observatory (evolving Linked Data since 2012)

Team & Contact

Ireland)

Galway, Ireland)

Google group

Tobias Käfer (KIT, Karlsruhe)

Jürgen Umbrich (DERL Galway)

Patrick O'Byrne (NUIG, DERI, Galway,

Ahmed Abdelrahman (NUIG, DERI,

Aidan Hogan (DERI, Galway)



#### 

Datasets

About

Results

Publications

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#### The Dynamic Linked Data Observatory

The Dynamic Linked Data Observatory is a framework to monitor Linked Data over an extended period of time. The core goal of our work is to collect frequent, continuous snapshots of a subset of the Web of Data that is interesting for further study and experimentation, with an aim to capture raw data about the dynamics of Linked Data. The resulting corpora will be made openly and continuously available to the Linked Data research community.

#### Datasets

" Good news! We started with the weekly crawls.

**Update** The newest crawl dumps should be available for download roughly one day after they got crawled.

#### Publications

Tobias Käfer, Ahmed Abdelrahman, Jürgen Umbrich, Patrick O'Byrne, Aidan Hogan. "*Observing Linked Data Dynamics*". In the Proceedings of the 10th Extended Semantic Web Conference (ESWC 2013), Montpellier, France, 26– 30 May, 2013.

Parent Directory	
<u>2012-05-06/</u>	08-Dec-2012 12:33
<u>2012-05-13/</u>	08-Dec-2012 12:40
<u>2012-05-21/</u>	08-Dec-2012 11:57
<u>2012-05-27/</u>	08-Dec-2012 11:57
2012-06-03/	05-Dec-2012 17:25
<u>2012-06-10/</u>	08-Dec-2012 11:58
<u>2012-06-17/</u>	08-Dec-2012 11:59
<u>2012-06-24/</u>	08-Dec-2012 11:59
<u>2012-07-01/</u>	05-Dec-2012 17:25
<u>2012-07-08/</u>	08-Dec-2012 12:00
<u>2012-07-16/</u>	08-Dec-2012 12:00
<u>2012-07-22/</u>	08-Dec-2012 12:01
<u>2012-07-29/</u>	08-Dec-2012 12:01
<u>2012-08-05/</u>	04-Dec-2012 10:54

# Weekly dumps of crawl snapshots...

Granularity? Queries? Completeness? Crawl failures?



## **Research challenges on evolving structured interlinked data**



- How can we represent archives of continuously evolving linked datasets? (efficiency vs. compact representation)
- How can we *minimize the redundant information* of archives? (e.g. duplicates in snapshots)
- How can we improve completeness of archiving?
- How can emerging retrieval demands in archiving be satisfied?
  - *e.g.* time-traversing and traceability? Avoiding bottlenecks?
- How can certain time-specific queries over archives be answered?
  - Can we re-use existing technologies (*e.g.* SPARQL or temporal extensions)?
  - What is the right **query language** for such queries?
  - *e.g.* knowing if a dataset has changed, and how, in a certain time period?

## **General archiving challenges**



#### The synchronisation problem

• how can we monitor changes?

#### The appraisal problem

 how can we assess the quality of a dataset? (and does archiving help with that?)

#### The archiving & query problem

 how can we efficiently archive and perform time-based retrieval queries of a dataset?



## The synchronization problem

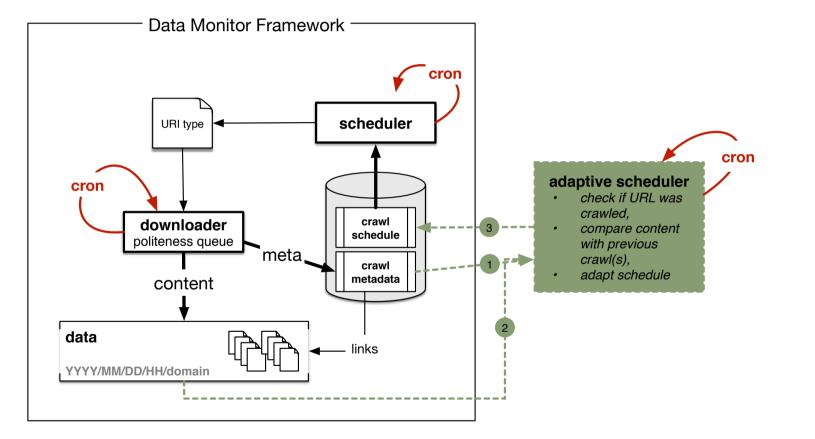
#### how can we monitor changes?

## Pull changes (crawl) vs. Push changes (notify)



- Observations:
  - Some services that publish or are mapped to RDF change regularly, but we don't know the frequency upfront!
  - Some services mapped to RDF announce/archive their changes already, so they already keep an archive...

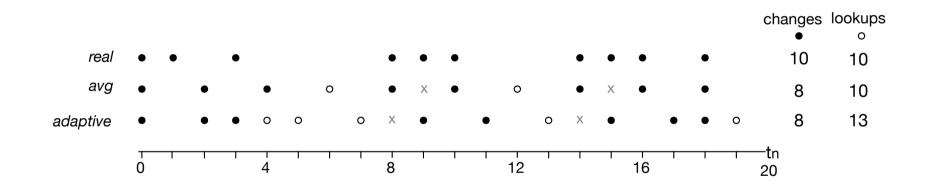
# **1-** An adaptive archiver (recall: DIACHRON WS 2015)



## **Experiment: Rescheduling**



 Evaluating strategies to compute next crawl time for URLs to accurately capture content change



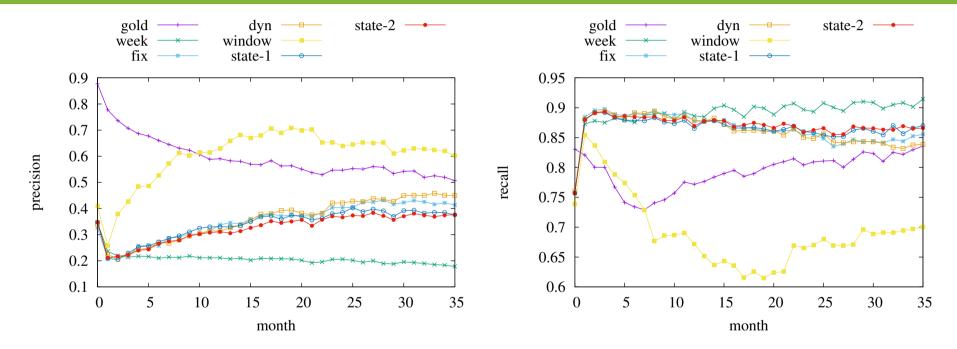
#### **Test setup**



- Revision history of 2660 wikipedia-articles
  - Wiki-changes do not follow a typical Poisson distribution
- Several heuristics; e.g.:
  - e.g., increase the crawl frequency,..."
  - "if you observe several changes in a row"
  - "if the probability is high that the content changes after we observed a change in the last snapshot" → Markov models
  - "If the document changed more often than 50% in the last 10 days ...."

#### **Results**



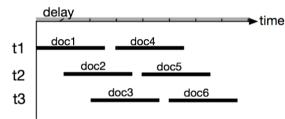


We observed the typical trade-off between recall and precision...

Strategies based on Markov models seems to provide best and most stable trade-off

## **Experiment: Improve completeness** - Crawl time estimation

- Aim: Estimate the overall crawl time and needed number of threads for a set of URLs from different domains
- Heuristic
  - 1. Estimate the crawl time per domain
    - Average download time, domain delay etc...
  - 2. First-fit bin-packing algorithms to determine overall crawl time



## **Results**



Table 3. Results of crawl time estimation

Actual crawl time	Overestimate (crawls)	Underestimate (crawls)	) total crawls
t < 30 min	78%~(202)	-16% (154)	356
30min < t < 60min	134% (25)	-18% (46)	71
60min < t < 120min	638% (19)	-11% (51)	70
120min < t < 180min	1.3%~(15)	-1% (215)	230
180min < t < 240min	- (0)	-36% (4)	4
t > 240min	- (0)	-44% (28)	28

- Large over estimation (is acceptable)
- Small underestimation (e.g. 10mins for 60mins crawl)

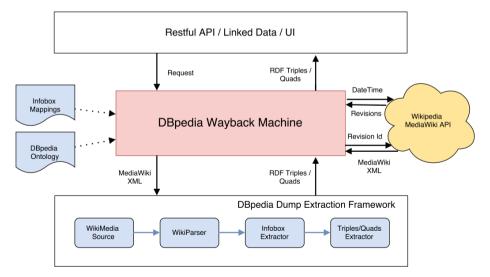
## Pull changes (crawl) vs. Push changes (notify)



- Observations:
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# 2- "Recreate" the versions from sources V (SEMANTICS 2015 demo...)

- If raw historical data on changes is is available...
- Aim: Fine grained access to previous versions, re-applying X2RDF transformations on the original source
- Example: DBpedia Wayback machine
  - Re-apply mappings on the Wikipedia revision history



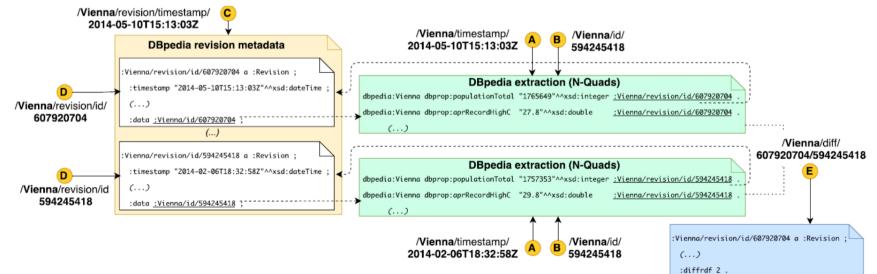


http://data.wu.ac.at/wayback/

## 2- "Recreate" the versions



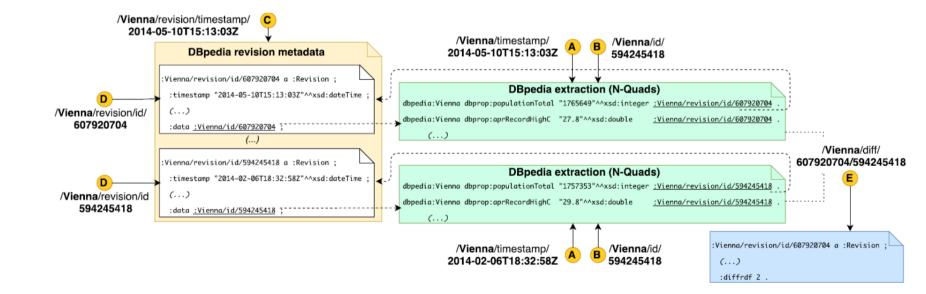
- How can one represent revisions while respecting DBpedia?
  - a) quads → <dbpediaSubject> <pred> <obj> <Revision> .
  - b) proprietary triples → <ownSubject/Revision> <pred> <obj> .
- Operations?
  - Get revisions meta-data for one resource (by revisionID or timestamp)
  - Get "materialised" versions of a resource (by revisionID or timestamp)
  - Get difference between two revisions



## 2- "Recreate" the versions

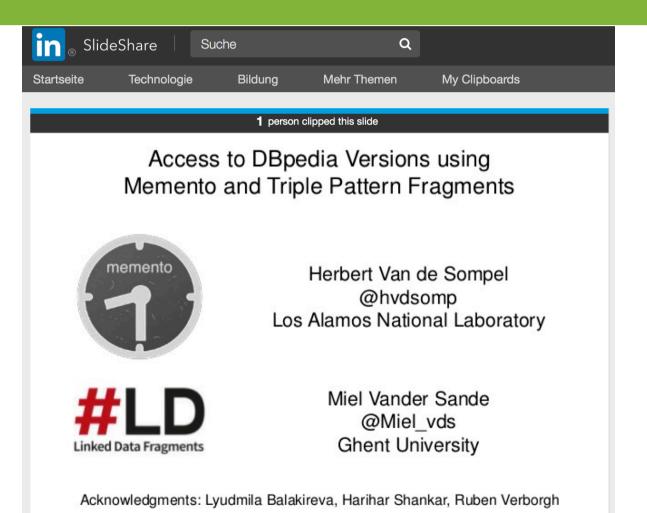


- More complex operations/queries? Open challenge
  - a) On-demand? Query rewriting, similar to RDB2RDF
  - b) Batch: Fetch the desired information, then store and query it



# We are (obviously) not the only ones looking into this...





However: Only one HDT per "irregular" dbpedia dump



## The appraisal problem

## How can we assess the quality of a dataset?

## **Data Quality issues:**



- Missing
- Outdated data
- Wrong data
- Ambiguous Data
- Wrong meta-data
- Data source offline/not reachable
- → Archiving & looking at the history of datasets helps!

## **Open Data Portals**



#### CKAN ... <u>http://ckan.org/</u>

- almost ",de facto" standard for Open Data Portals
- facilitates search, metadata (publisher, format, publication date, license, etc.) for datasets
- <u>http://datahub.io/</u>
- <u>http://data.gv.at/</u>
- machine-processable? ...
   martially



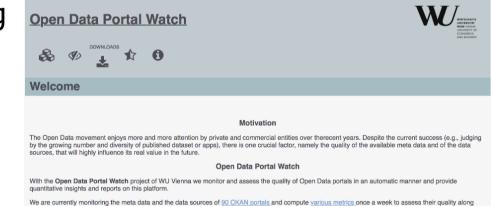
#### **OPEN DATA PORTAL WATCH** ... a first step.



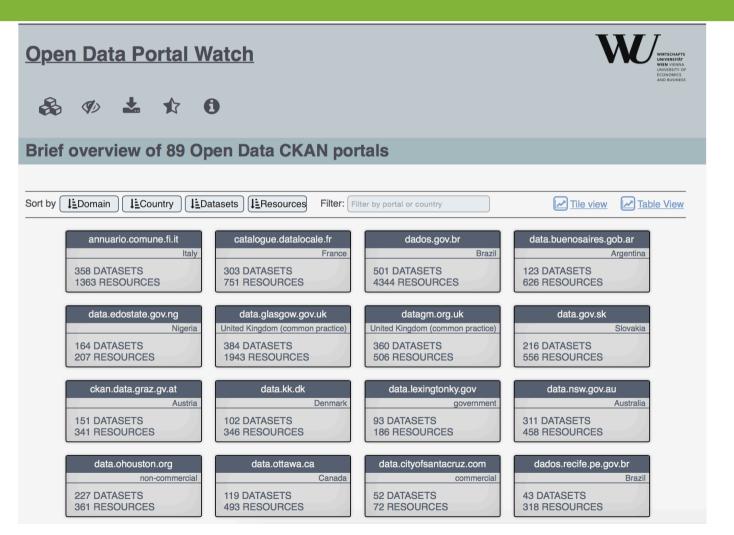
http://data.wu.ac.at/portalwatch/

several dimensions and track the evolution over time.

- Periodically monitoring a list of Open Data Portals
  - 90 CKAN powered Open Data Portals
- Quality assessment
- Evolution tracking
  - Meta data
  - Data



#### **Open Data Portal list**



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## **QUALITY DIMENSIONS**



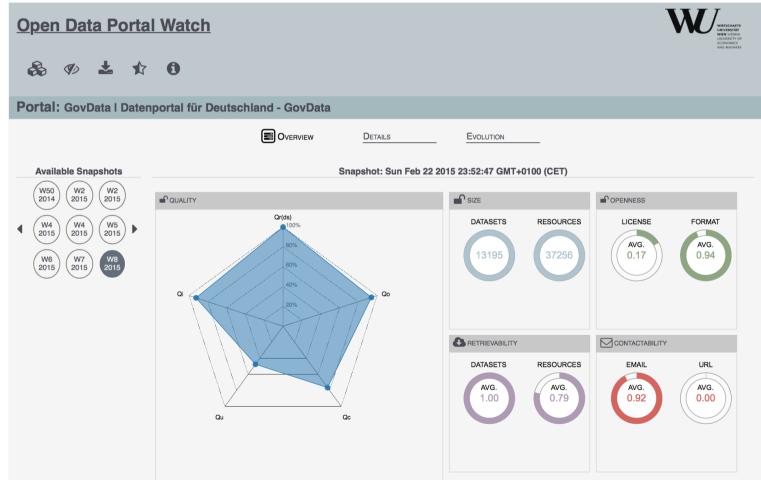
#### DIMENSION DESCRIPTION

Retrievability	The extent to which meta data and resources can be retrieved.
Usage	The extent to which available meta data keys are used to describe a dataset.
Completeness	The extent to which the used meta data keys are non empty.
Accuracy	The extent to which certain meta data values accurately describe the resources.
Openness	The extent to which licenses and file formats conform to the open definition.
Contactability	The extent to which the data publisher provide contact information.

Objective measures which can be automatically computed in a scalable way

#### **Portal Overview**

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#### **ODP Evolution**



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### **ODP CHANGES**



#### Changes between the first and last snapshots

#### dataset changes

#### 70 PORTALS WITH DATASET CHANGES

- Avg. increase by 87.05% for 60 portals
- Avg. decrease by -64.16% for 10 portals

#### Show 10 + entries

PORTAL         FROM         TO         CHANGE         ICHANGE PERCENTAGE           data.sa.gov.au (2014-07-17)→ (2015-03-15)         484         5721         5237         1082.02%           datos.codeandomexico.org (2014-07-17)→ (2015-03-15)         94         715         621         660.64%           data.opendataportal.at (2014-07-17)→ (2015-03-16)         46         323         277         602.17%           annuario.comune.fi.it (2014-07-17)→ (2015-03-16)         50         351         301         602.00%           udct-data.aigid.jp (2014-08-07)→ (2015-03-16)         431         2110         1679         389.56%           catalogo.datos.gob.mx (2014-08-07)→ (2015-03-16)         111         360         249         224.32%	Show 10 🗧 entries					Search:
(2014-07-17) $\rightarrow$ (2015-03-15)94715621660.64%datos.codeandomexico.org (2014-07-17) $\rightarrow$ (2015-03-15)94715621660.64%data.opendataportal.at (2014-07-17) $\rightarrow$ (2015-03-16)46323277602.17%annuario.comune.fi.it (2014-08-07) $\rightarrow$ (2015-03-15)50351301602.00%udct-data.aigid.jp (2014-08-07) $\rightarrow$ (2015-03-16)43121101679389.56%catalogo.datos.gob.mx111360249224.32%	1 PORTAL	FROM	ТО	CHANGE	↓CHANGE PERCENTAGE	
(2014-07-17) $\rightarrow$ (2015-03-15)(2015-03-16)(2015-03-16)(2015-03-16)(2015-03-16)data.opendataportal.at (2014-07-17) $\rightarrow$ (2015-03-16)46323277602.17%annuario.comune.fi.it (2014-08-07) $\rightarrow$ (2015-03-15)50351301602.00%udct-data.aigid.jp (2014-08-07) $\rightarrow$ (2015-03-16)43121101679389.56%catalogo.datos.gob.mx111360249224.32%	-	484	5721	5237		1082.02%
Image: contract of the state     Image: contract of the state     Image: contract of the state       (2014-07-17)→ (2015-03-16)     50     351     301     602.00%       (2014-08-07)→ (2015-03-15)     50     351     1679     389.56%       (2014-08-07)→ (2015-03-16)     111     360     249     224.32%	-	94	715	621		660.64%
(2014-08-07)→ (2015-03-15)     431     2110     1679     389.56%       (2014-08-07)→ (2015-03-16)     111     360     249     224.32%		46	323	277		602.17%
(2014-08-07)→ (2015-03-16)     111     360     249     224.32%		50	351	301		602.00%
		431	2110	1679		389.56%
	• •	111	360	249		224.32%

#### **Data Dumps**



 OPEN DATA PORTAL WATCH provides an archive of Open Data portal crawls (weekly snapshots/dynamic crawling framework):

#### Open Data Portal Watch Dumps

Name	Last modified	Size
Parent Directory		-
africaopendata.org/	16-Mar-2015 13:03	-
annuario.comune.fi.it/	16-Mar-2015 13:03	-
bermuda.io/	16-Mar-2015 13:14	-
catalog.data.gov/	05-Feb-2015 15:28	-
catalog.data.ug/	16-Mar-2015 13:07	-
catalogo.datos.gob.mx/	16-Mar-2015 13:08	-
catalogodatos.gub.uy/	16-Mar-2015 13:15	-

#### **Open Data Portal Watch Dumps**

•	
Last modified	Size
	-
05-Feb-2015 15:13	2.2M
05-Feb-2015 15:14	2.2M
05-Feb-2015 15:14	2.2M
05-Feb-2015 15:14	2.2M
	05-Feb-2015 15:13         05-Feb-2015 15:13         05-Feb-2015 15:13         05-Feb-2015 15:13         05-Feb-2015 15:13         05-Feb-2015 15:13         05-Feb-2015 15:14

### **Open Data Portal Watch**



#### lity assessment & evolution of Open Data portals

Jürgen Umbrich<sup>\*</sup>, Sebastian Neumaier<sup>\*</sup>, Axel Polleres<sup>\*</sup> Vienna University of Economics and Business, Vienna, Austria Email: \*firstname.lastname@wu.ac.at

Best paper award at IEEE OBD-2015 ☺

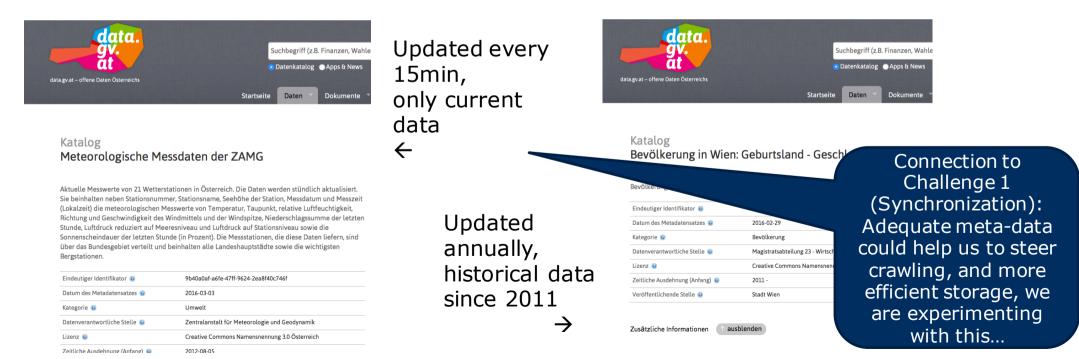
#### http://data.wu.ac.at/portalwatch/

#### Key findings:

- Significantly varying quality across portals
- Rapid growth for some portals
- Huge variety and range of datasets
- Open Data Portal search is a big problem
- Time: many datasets only provide **current**, but no **historical** data

### Historical vs. current-only data (monotonic changes vs. nonmonotonic changes)

- Weather data (every 15min) from 21 Austrian weather stations...
- VS.
- Population per gender and age in Vienna districts



# Now: How do data quality and archiving connect?

- Idea: if we know how data changed, we could assess "bogus" changes...
  - Look at time series: Detect outliers over historical data
  - Example: wikipedia change history!
    - Wrong/disputed data changes often!

e.g. obvious Idea: Once data is semantically integrated in an archive, it is easy to include time-series analysis to filter out implausible/inconsistent data automatically...



# Now: How do data quality and archiving connect?

- An idea only, so far: if we know how data changed, we could assess "bogus" changes...
  - Look at time series: Detect outliers over historical data
  - Example: wikipedia change history!
    - Assumption:Wrong/disputed data changes Manufactory Inference between revisions

		nevision as of 23.35, 25 March 2005 (edit)	nevision as of 02.29, 30 March 2009 (eut) (undo)
Student hoaxes world's media		70.92.177.157 (talk)	86.42.227.123 (talk)
Student noaxes world's media		← Previous edit	Next edit →
on Wikipedia		Line 54:	Line 54:
-			Life 54.
Phony quote appears in obituaries for French composer Maurice Jarre		==Music style==	==Music style==
Leading comments X If Recommend (0 Leading comments		Jarre wrote mainly for [[orchestra]]s, but began to favor [[synthesizerlsynthesized]] music in the 1980s, mostly for practical rather than aesthetic motivations, many critics	Jarre wrote mainly for [[orchestra]]s, but began to favor [[synthesizerisynthesized]] music in the 1980s, mostly for practical rather than aesthetic motivations, many critics
Below: Discuss Related		feel.{{FactIdate=February 2007}} Jarre denies this and has pointed out that his electronic score for "[[Witness (1985 film]]Witness]]" was actually more laborious, time-consuming	feel.{{FactIdate=February 2007}} Jarre denies this and has pointed out that his electronic score for "[[Witness (1985 film]]Witness]]" was actually more laborious, time-consuming
By Shawn Pogatchnik		and expensive to produce than an orchestral score. Jarre's electronic scores from the 80s also include "[Fatal Attraction]", "[The Year of Living Dangerously]" and "[No Way Out (1987 film)]No Way Out]]". A number of his scores from that era also feature electronic/acoustic blends, such as "[[Gorillas in the Mist]]", "[[Dead Poets Society]]", "[[The Mosquito Coast]]" and "[Jacob's Ladder (movie) Jacob's Ladder]]".	and expensive to produce than an orchestral score. Jarré's electronic scores from the 80s also include "[[Fatal Attraction]", "[[The Year of Living Dangerous/]]" and "[[No Way Out (1997 film]No Way Out]]". A number of his scores from that era also feature electronic/acoustic blends, such as "[[Golfals in the Mat]]", "[[Dead Poets Society]]", "[[The Mosquito Coast]]" and "[Jacob's Ladder (movie).Jacob's Ladder]]".
phony quote on Wikipedia, he said he was testing how our globalized, increasingly Internet-dependent media was upholding accuracy and accountability in an age of			+
instant news.			
			+ ==Quotes==
His report card: Wikipedia passed. Journalism flunked. The sociology major's made-up quote — which he added to the Wikipedia page of Maurice Jarre hours after the French composer's death March 28 — flew straight on			Nowadays, if a studio assumes that his film is bad, there is always an executive that gets more nervous than usual and thinks that if they change the music, the film will become a
to dozens of U.S. blogs and newspaper Web sites in Britain, Australia and India.			masterpiece.
They used the fabricated material, Fitzgerald said, even though administrators at the			+
free online encyclopedia quickly caught the quote's lack of attribution and removed			One could say my life itself has been one long soundtrack. Music was my life, music
it, but not quickly enough to keep some journalists from cutting and pasting it first.			+ brought me to life, and music is how I will be remembered long after I leave this life. When
A full month went by and nobody noticed the editorial fraud. So Fitzgerald told			I die there will be a final waltz playing in my head and that only I can hear.
several media outlets in an e-mail and the corrections began.			+
"I was really shocked at the results from the experiment," Fitzgerald, 22, said	Fionn Kidney / AP Shane Fitzgerald's obituary-friendly quote — which he		
Monday in an interview a week after one newspaper at fault, The Guardian of Britain,	added to the Wikipedia page of Maurice Jarre hours after the French composer's death March 28 — flew straight on		<ul> <li>When I was 15, I did not know nothing about what concerned the world of music</li> </ul>
became the first to admit its obituarist lifted material straight from Wikipedia.	to dozens of U.S. blogs and newspaper Web sites in Britain. Australia and India.		+
	an country product acta acta in the		
			Owner I considered about an exception consistent for the exception of the

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Wiki Loves Earth in focus during May. Discover nature, take pictures, help Wikipedia and wint

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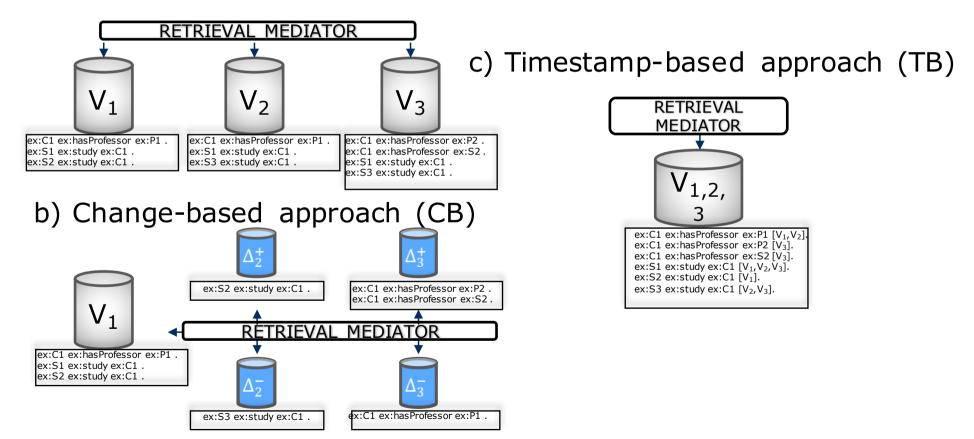


## Finally: The archiving problem

# Now, how can we efficiently archive and perform time-based retrieval queries of a dataset?

### **RDF Archiving. Archiving policies**

a) Independent Copies/Snapshots (IC)



### **RDF Archiving.** Querying



- Structured query languages managing time.
  - Temporal databases (T-Quel, TSQL2)
    - Overlapping, meeting, before, equal, during, finish
  - RDF/Linked Data
    - SPARQL extensions
      - T-SPARQL, SPARQL-ST
      - AnQL
    - DIACHRON Query Language
      - SPARQL with specific constructors such as DATASET (similar to a named graph), VERSION, or CHANGES



- How can one define the corpus?
- How can one design benchmark queries? Which queries?
- BEAR: concrete basic benchmark
  - Data: Crawl from Linked Data Observatory
  - Basic queries: Materialize, get Version...
  - Initial evaluation on archiving policies





- How can one define the corpus?
- How can one design benchmark queries? Which queries?
- BEAR: concrete basic benchmark
  - Data: Crawl from Linked Data Observatory
  - Basic queries: Materialize, get Version...
  - Initial evaluation on archiving policies





- Define the corpus
  - Number of versions / size

**Definition 1 (RDF Archive).** A version-annotated triple is an RDF triple (s, p, o) with a label  $i \in \mathcal{N}$  representing the version in which this triple holds, denoted by the notation (s, p, o) : [i]. An RDF archive graph  $\mathcal{A}$  is a set of version-annotated triples.

- Data dynamicity
  - $\heartsuit$  Version change ratio
  - Version data growth
- Data static core
- □ Total triples (version-oblivious)
- ☑ RDF vocabulary
  - ♀ Per version / evolution



- Cardinality / Selectivity + <u>dynamicity</u>
- ♀ Archive-driven C/S/D
- ♀ Version-driven C/S/D
- ♀ Basic temporal retrieval features of queries
  - ♀ Version/Delta Materialization (V<sub>i</sub>)
  - $\square$  Version(Q): in which version Q is not empty
  - Change(Vi,Vj): true if delta!=null
  - $\square$  Join(Q1,V<sub>i</sub>, Q2,V<sub>j</sub>)
  - ▷ Change(Q): Returns versions in which Diff(Q,  $V_i$ ,  $V_{i-1}$ )  $!=\emptyset$

### **BEAR:** instantiation of basic query features

- Instantiation of basic archive queries, e.g. in AnQL [1]
  - Antoine Zimmermann, Nuno Lopes, Axel Polleres, Straccia. A general framework for representing, re querying with annotated Semantic Web data. Journ Semantics (JWS), 12:72--95, March 2012.

Open question remains: What is the right query syntax for archive queries?

- *Mat(Q,V)*
- Diff(Q,V1,V2)
- Ver(Q)
- join(Q1,vi,Q2,vj)
- Change(Q)

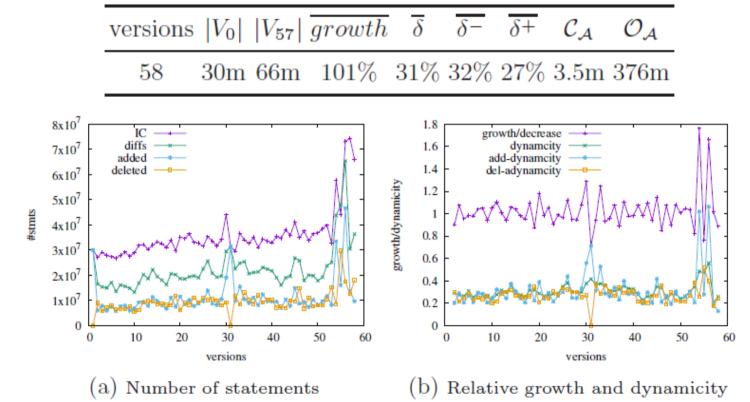
SELECT ?V1 ?V2 WHERE
{ {{P :?V1 } MINUS {P :?V2}} UNION
 {{P :?V2 } MINUS {P :?V1}}
 FILTER( abs(?V1-?V2) = 1 ) }

- blueprint on benchmarking archives of semantic data
  - How can one define the corpus?
  - How can one design benchmark queries? Which queries?
- BEAR: concrete basic benchmark
  - Data: Crawl from Linked Data Observatory
  - Basic queries: Materialize, get Version...
  - Initial evaluation of archiving policies (IC,CB,TB)





#### Corpus





- We implemented and evaluate archiving systems on Jena-TDB and HDT, based on IC, CB and TB policies.
  - Confirm the initial premises of the archiving policies:
    - In space, IC is the worst, CB improves the space and TB increases the size as it has to index a new dimension
    - In time, CB is bad at getting a particular version because it has to reapply the changes ... (but good e.g. for Change(SELECT \* {?S ?P ?O})
  - Serve as an initial baseline to compare archiving systems
  - More info: <u>https://github.com/webdata/BEAR</u>

# Finally, many open questions remain still!



#### Archiving and querying evolving semantic Web data

Objective	Research Question		
Representation	<ul> <li>minimize the redundant information</li> <li>respect the original modeling and provenance information</li> </ul>		
Query language	<ul> <li>capture the expressiveness of emerging retrieval demands in archiving</li> <li>our base operations are meant to be an extensible starting point</li> <li>design a query language satisfying these requirements for evolving interlinked data</li> </ul>		
Indexing	Index archives at large scale (and keeping up with evolution rate – streamingvs. archiving) to process the queries efficiently		
Query optimization	<ul> <li>optimizing query resolution plans for archives</li> <li>enabling the integration of other sources (federated infrastructure)</li> <li>Query rewriting for querying archives of structured non-RDF sources? Open Data!</li> </ul>		
Application	<ul> <li>Is there a actual and urgent need in the community?</li> <li>We believe yes, but where's the killer-app?</li> </ul>		

## Thanks!



#### Dept. of Information Systems & Operations

Institute for Information Business Welthandelsplatz 1, 1020 Vienna, Austria

#### **Univ.Prof. Dr. Axel Polleres**

T +43-1-31336/5297 axel.polleres@wu.ac.at polleres.net Big (Semantic) Data Versions Evolving Data Streaming Compression



- Instantiation of archive queries in AnQL [1]
  - Antoine Zimmermann, Nuno Lopes, Axel Polleres, and Umberto Straccia. A general framework for representing, reasoning and querying with annotated Semantic Web data. Journal of Web Semantics (JWS), 12:72--95, March 2012.
  - *Mat(Q,V)*
  - Diff(Q,V1,V2)
  - Ver(Q)
- join(Q1,vi,Q2,vj)
- Change(Q)

SELECT \* WHERE { Q :[v] }



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  - Diff(Q,V1,V2)
  - Ver(Q)
  - join(Q1,vi,Q2,vj)
  - Change(Q)

```
SELECT * WHERE {
  { {Q :[v1]} MINUS {Q :[v2]} } BIND (v1 AS ?V )
  }
UNION
  { { {Q :[v2] } MINUS {Q :[v1]} BIND (v2 AS ?V )
  }
}
```



- Instantiation of archive queries in AnQL [1]
  - Antoine Zimmermann, Nuno Lopes, Axel Polleres, and Umberto Straccia. A general framework for representing, reasoning and querying with annotated Semantic Web data. Journal of Web Semantics (JWS), 12:72--95, March 2012.
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- join(Q1,vi,Q2,vj)
- Change(Q)



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  - Diff(Q,V1,V2)

join(Q1,v1,Q2,v2)

Ver(Q)

SELECT \* WHERE { {Q : [v1]} {Q : [v2]} }

Change(Q)



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```
SELECT ?V1 ?V2 WHERE
{ {{P :?V1 } MINUS {P :?V2}} UNION
    {{P :?V2 } MINUS {P :?V1}}
    FILTER( abs(?V1-?V2) = 1 ) }
```