

Sharing massive data analysis: from provenance to linked experiment reports

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Sharing massive data analysis: from provenance to linked experiment reports

Scientific workflows, provenance and linked data to the rescue

Alban Gaignard, PhD, CNRS

Toulouse, 13 november 2018 APSEM 2018







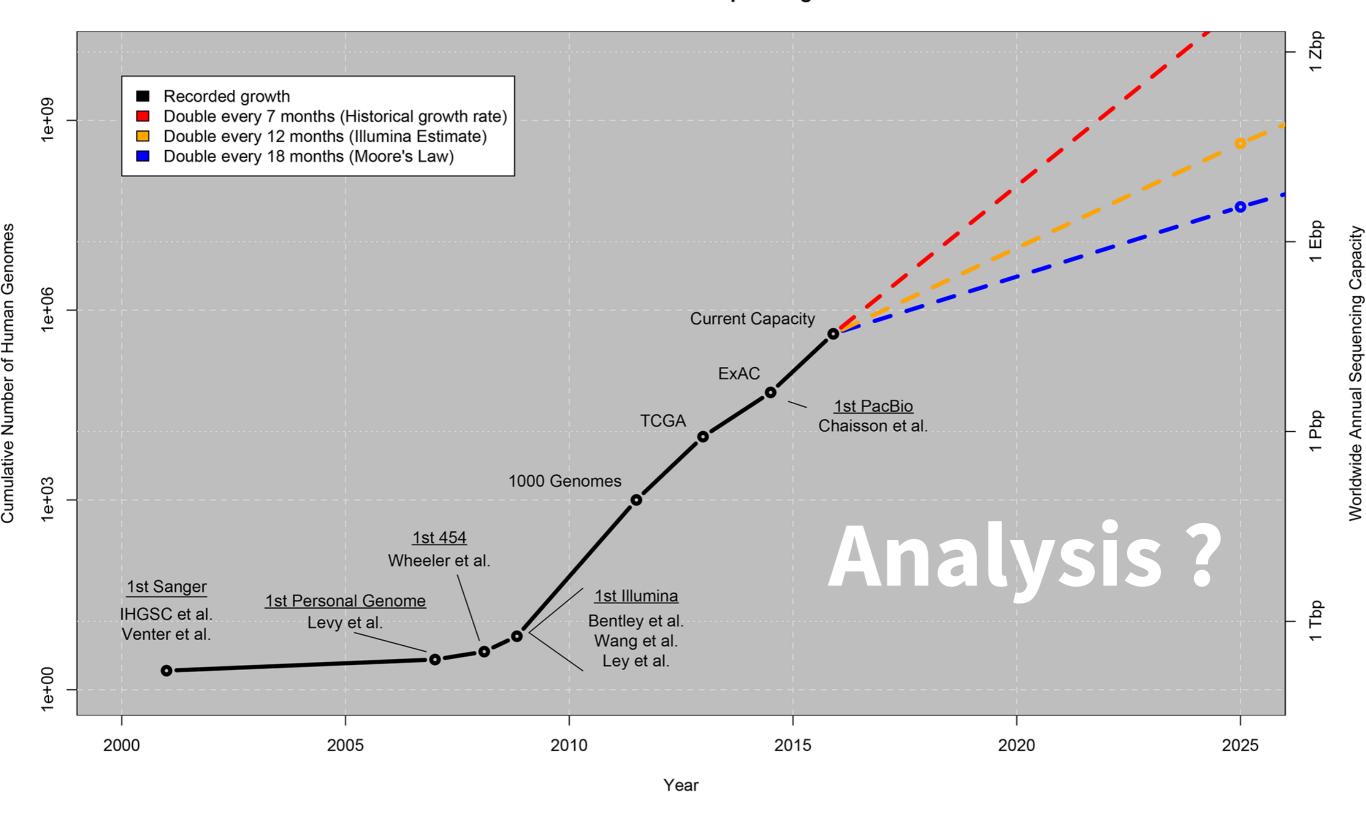




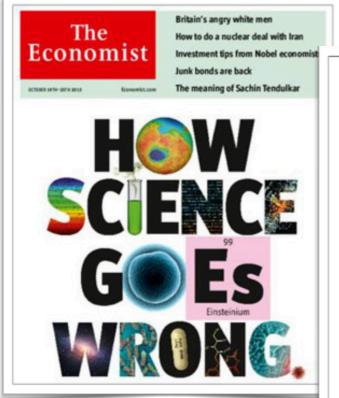
Reproducibility at the age of massive data

Massive life science data production

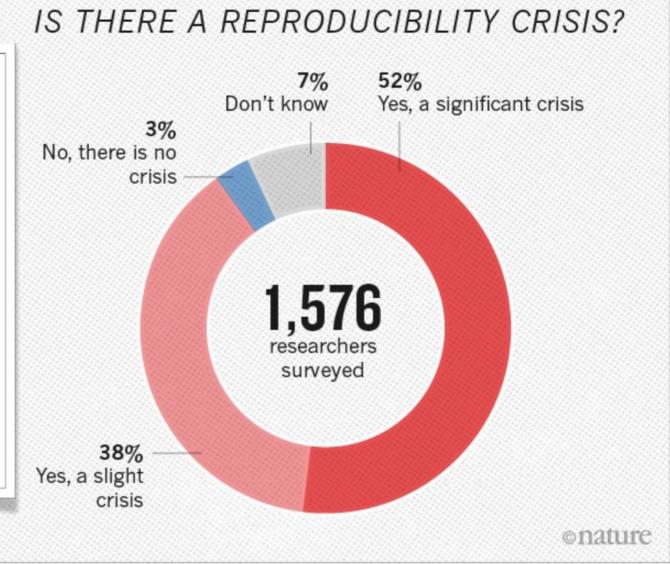
Growth of DNA Sequencing



Knowledge production







COMMENT

612 | NATURE | VOL 505 | 30 JANUARY 2014

NIH plans to enhance reproducibility

Francis S. Collins and Lawrence A. Tabak discuss initiatives that the US National Institutes of Health is exploring to restore the self-correcting nature of preclinical research.

agrowing chorus of concern, from scientists and laypeople, contends that the complex system for ensuring the reproducibility of biomedical research is failing and is in need of restructuring^{1,2}. As leaders of the US National Institutes of Health (NIH), we share this concern and here explore some of the significant interventions that we are planning.

Science has long been regarded as 'self-correcting', given that it is founded on the

shorter term, however, the checks and balances that once ensured scientific fidelity have been hobbled. This has compromised the ability of today's researchers to reproduce others' findings.

Let's be clear: with rare exceptions, we have no evidence to suggest that irreproducibility is about scientific misconduct. In 2011, the Office of Research Integrity of the US Department of Health and Human Services pursued only 12 such cases³.

« In 2012, Amgen researchers made headlines when they declared that they had been unable to reproduce the findings in 47 of 53 'landmark' cancer papers » (doi:10.1038/nature.2016.19269)

Repeat < Replicate < Reproduce < Reuse

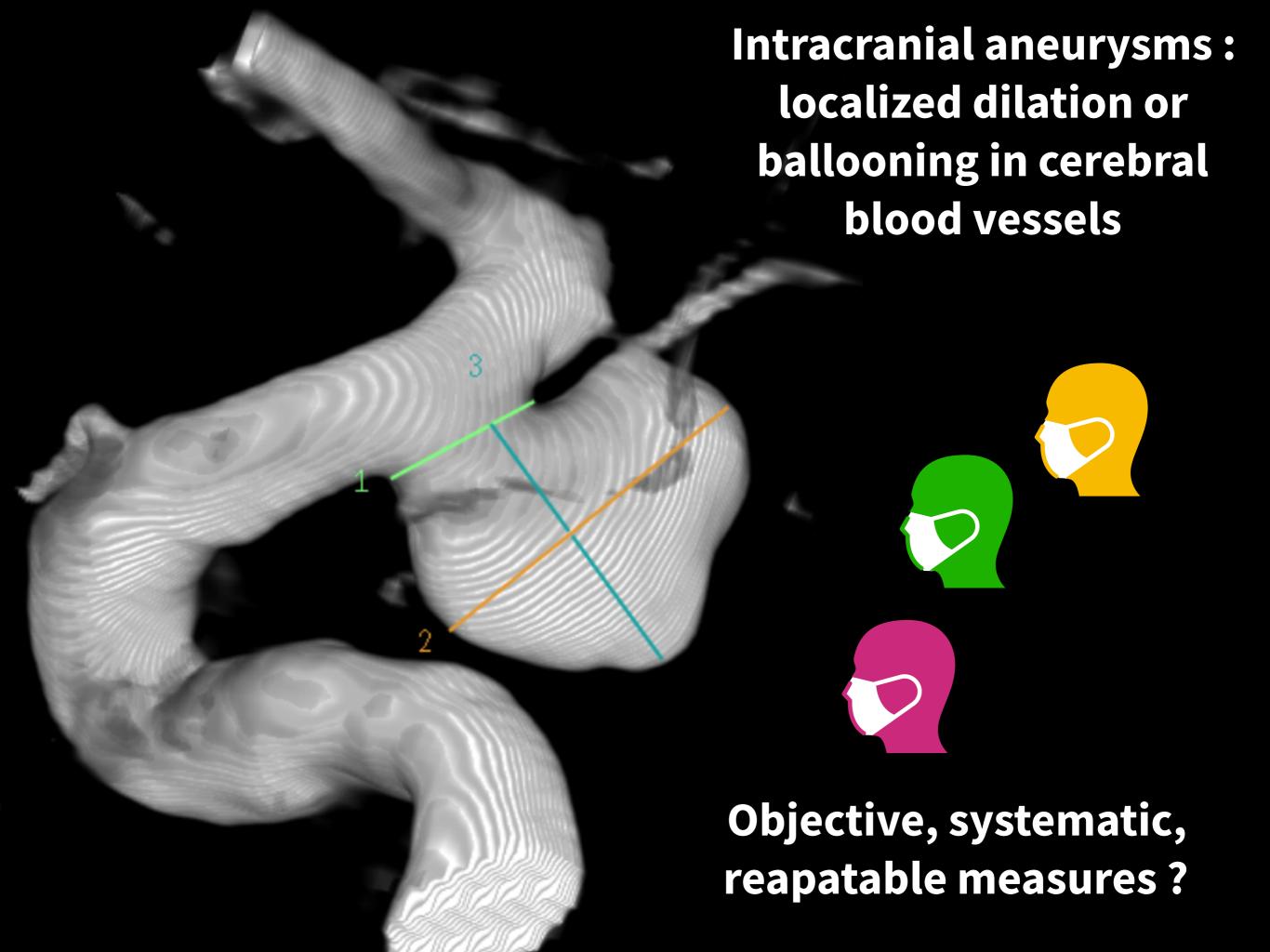
Same experiment Same experiment Same experiment

Same setup Same setup

Same lab Same lab

Same setup new experiment, Same lab some comonalities

S. Cohen-Boulakia, K. Belhajjame, O. Collin, J. Chopard, C. Froidevaux, A. Gaignard, K. Hinsen, P. Larmande, Y. Le Bras, F. Lemoine, F. Mareuil, H. Ménager, C. Pradal, C. Blanchet, Scientific workflows for computational reproducibility in the life sciences: Status, challenges and opportunities, Future Generation Computer Systems, Volume 75, 2017, https://doi.org/10.1016/j.future.2017.01.012.

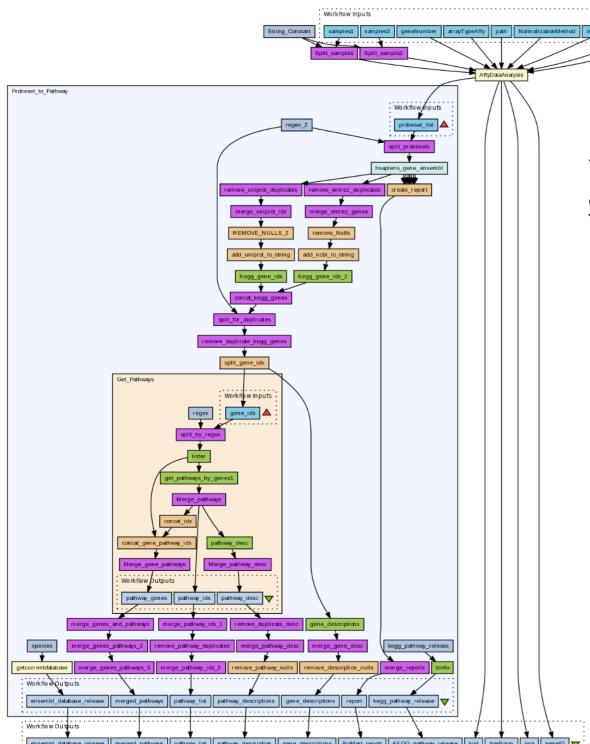


Scientific workflows to the rescue ...

What is a workflow?

« Workflows provide a systematic way of describing the **methods** needed and provide the **interface** between **domain specialists** and **computing infrastructures**. »

« Workflow management systems (WMS) perform the complex analyses on a variety of distributed resources »



Scientific workflows to enhance **trust** in scientific results:

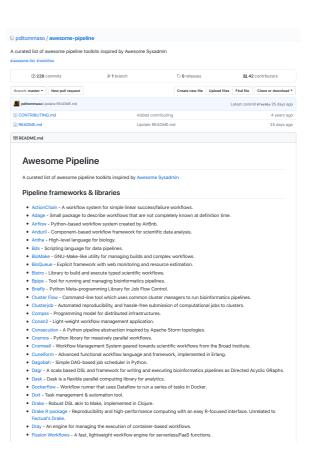
- → automate data analysis (at scale)
- → **abstraction** (describe/share methods)
 - → provenance (~transparency)











Provenance: a way to reuse produced & analysed data

Definition: Oxford dictionnary

« The beginning of something's existence; something's origin. »

Definition: Computer Science

« Provenance information describes the **origins** and the **history of data in its life cycle**. »

« Today, data is often made available on the Internet with **no centralized control over its integrity**: data is constantly being created, copied, moved around, and combined indiscriminately. Because information sources (or different parts of a single large source) may vary widely in terms of quality, it is essential to provide **provenance** and other context information which can **help end users** judge whether query results are **trustworthy**. »

Representing provenance



PROV-O: The PROV Ontology

W3C Recommendation 30 April 2013

This version:

http://www.w3.org/TR/2013/REC-prov-o-20130430/

Latest published version:

http://www.w3.org/TR/prov-o/

Implementation report:

http://www.w3.org/TR/2013/NOTE-prov-implementations-20130430/

Previous version:

http://www.w3.org/TR/2013/PR-prov-o-20130312/

Editors:

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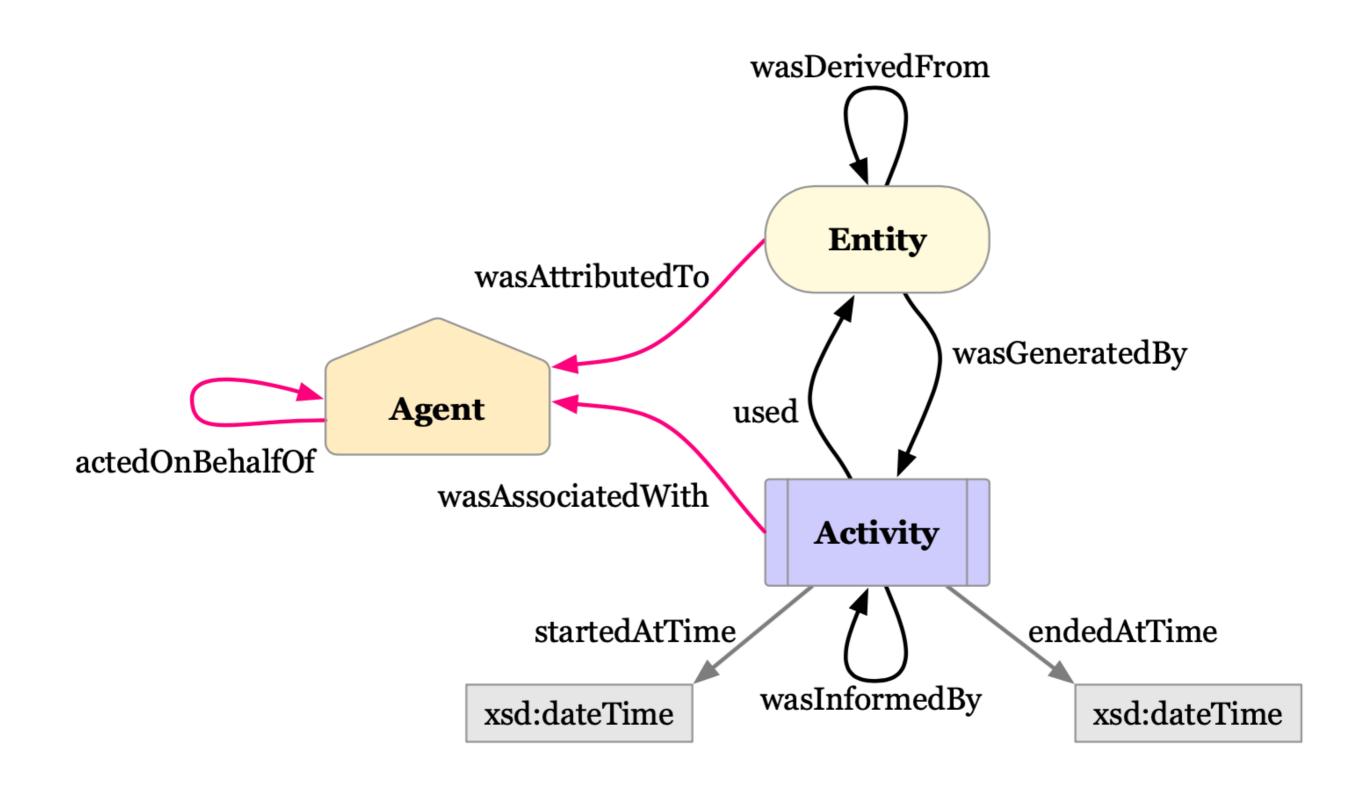
David Corsar, University of Aberdeen, UK

Daniel Garijo, Ontology Engineering Group, Universidad Politécnica de Madrid, Spain

Stian Soiland-Reyes, University of Manchester, UK

Stephan Zednik, Rensselaer Polytechnic Institute, USA

Jun Zhao, University of Oxford, UK



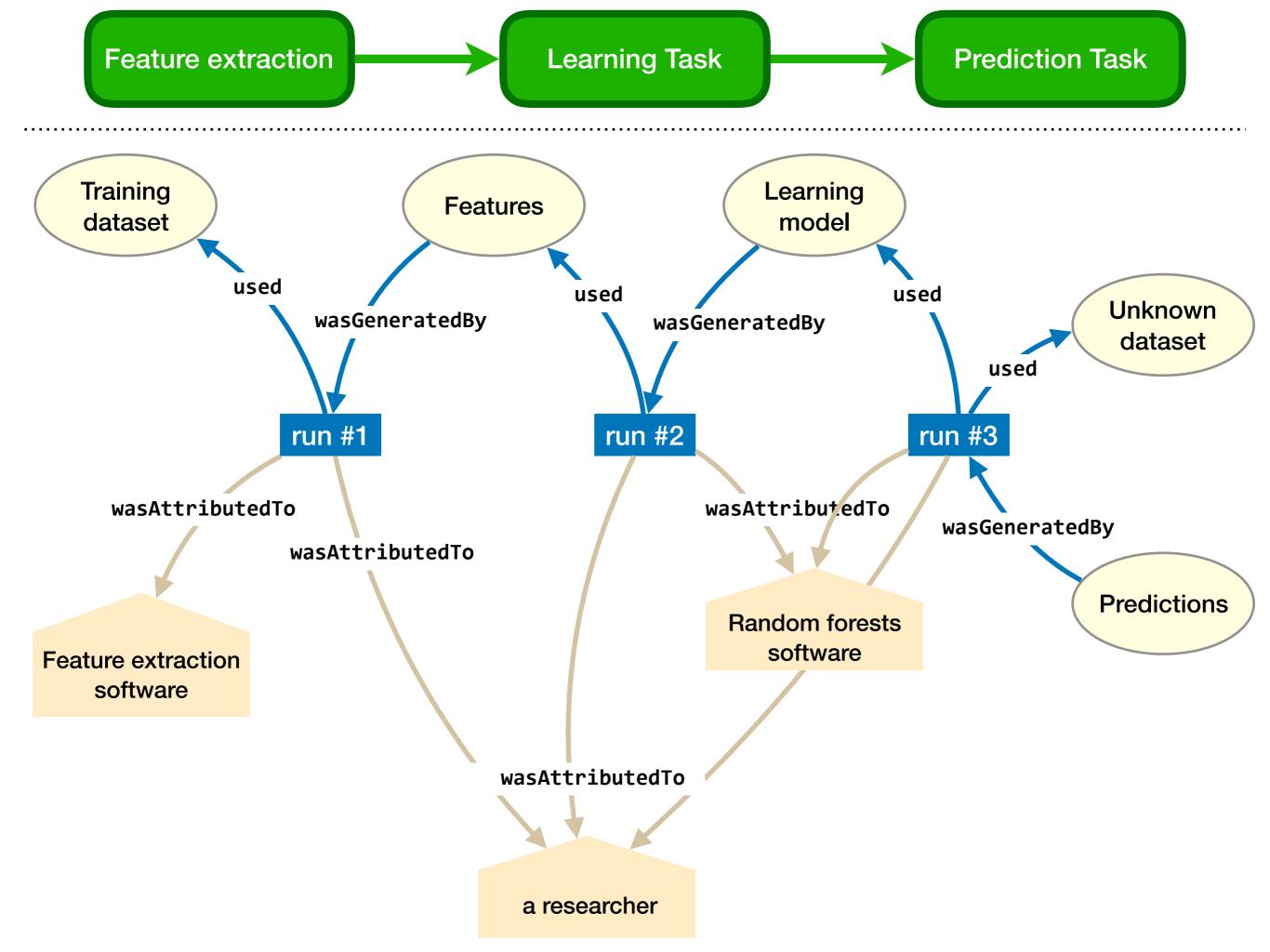
Training dataset

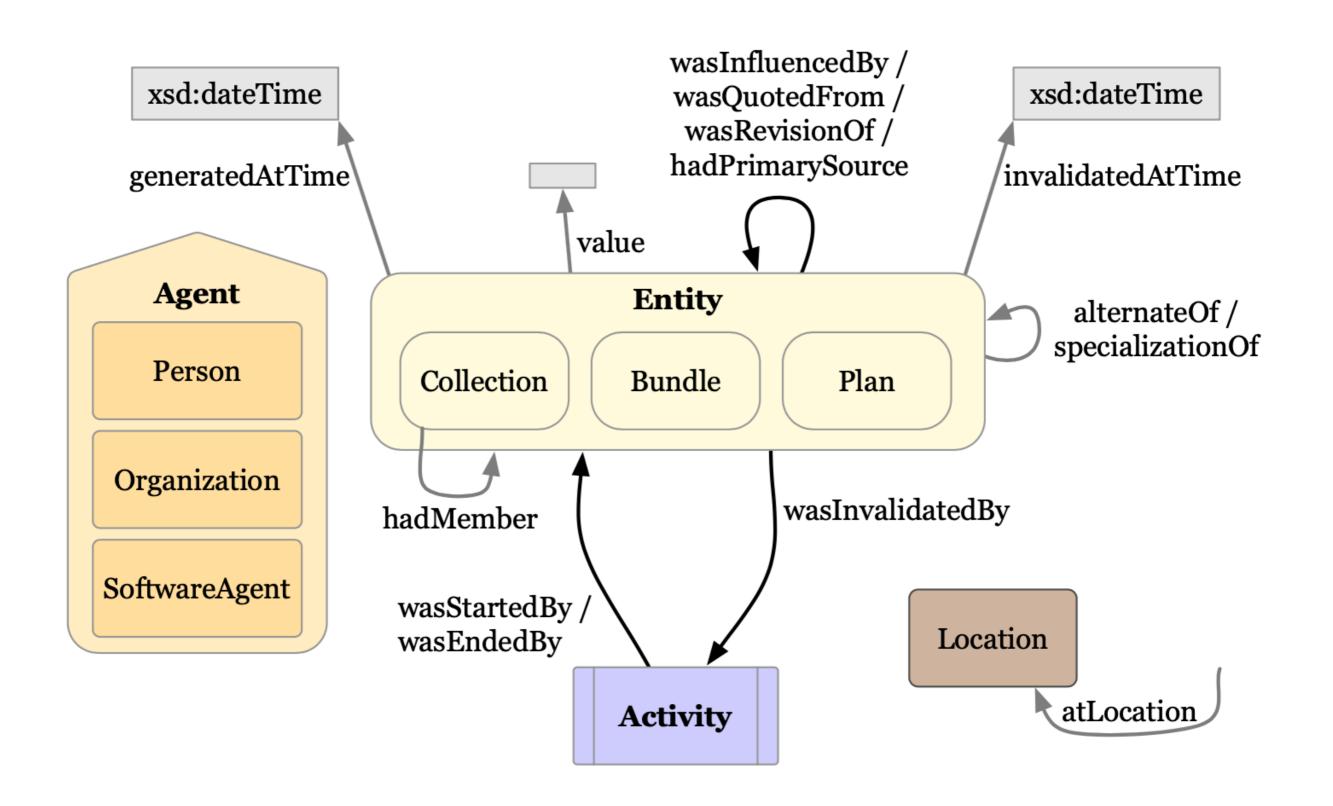
Features

Learning model

Unknown dataset

Predictions





Reasoning with provenance



Constraints of the PROV Data Model

W3C Recommendation 30 April 2013

This version:

http://www.w3.org/TR/2013/REC-prov-constraints-20130430/

Latest published version:

http://www.w3.org/TR/prov-constraints/

Test suite:

http://dvcs.w3.org/hg/prov/raw-file/default/testcases/process.html

Implementation report:

http://www.w3.org/TR/2013/NOTE-prov-implementations-20130430/

Previous version:

http://www.w3.org/TR/2013/PR-prov-constraints-20130312/ (color-coded diff)

Editors:

<u>James Cheney</u>, University of Edinburgh <u>Paolo Missier</u>, Newcastle University <u>Luc Moreau</u>, University of Southampton

Author:

Tom De Nies, iMinds - Ghent University

Please refer to the errata for this document, which may include some normative corrections.

The English version of this specification is the only normative version. Non-normative translations may also be available.

Copyright © 2012-2013 W3C® (MIT, ERCIM, Keio, Beihang), All Rights Reserved. W3C liability, trademark and document use rules apply.

5.3 Derivations

Derivations with explicit activity, generation, and usage admit the following inference:

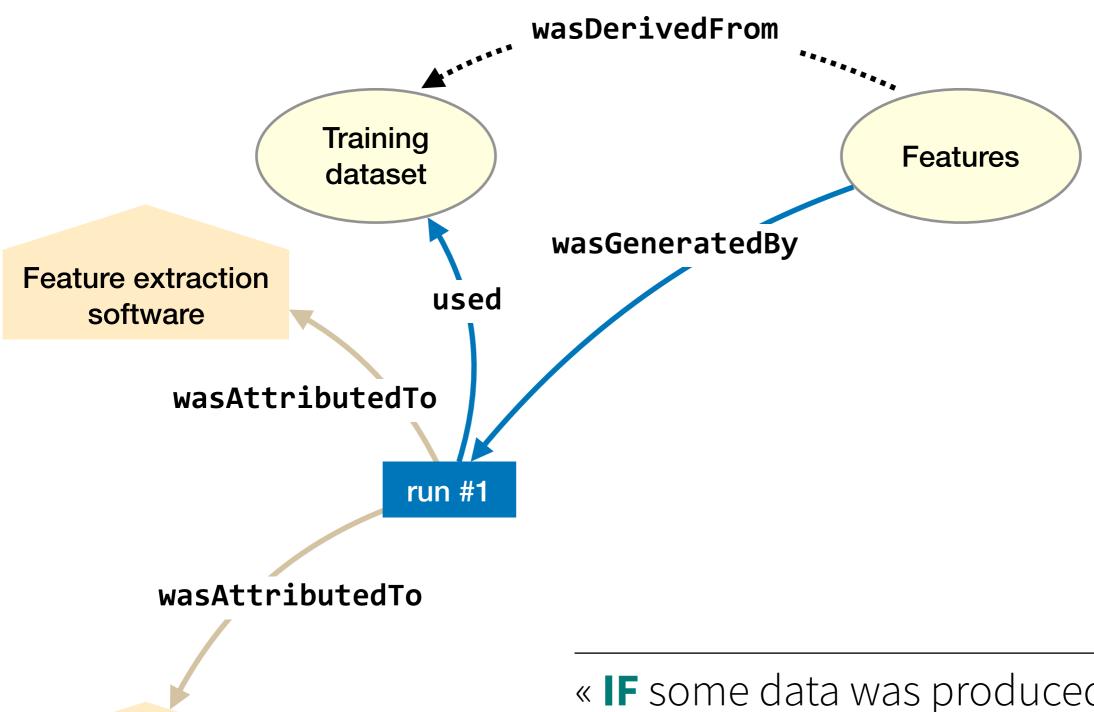
Inference 11 (derivation-generation-use-inference)

In this inference, none of a, gen2 or use1 can be placeholders -.

IF wasDerivedFrom(_id; e2,e1,a,gen2,use1,_attrs), THEN there exists _t1 and _t2 such that used(use1; a,e1,_t1,[]) and wasGeneratedBy(gen2; e2,a,_t2,[]).

Inference 15 (influence-inference)

- 1. IF wasGeneratedBy(id; e,a, t,attrs) THEN wasInfluencedBy(id; e, a, attrs).
- 2. IF used(id; a,e,_t,attrs) THEN wasInfluencedBy(id; a, e, attrs).
- 3. | wasInformedBy(id; a2,a1,attrs) THEN wasInfluencedBy(id; a2, a1, attrs).
- 4. IF wasStartedBy(id; a2,e,_a1,_t,attrs) THEN wasInfluencedBy(id; a2, e, attrs).
- 5. | wasEndedBy(id; a2,e,_a1,_t,attrs) | THEN wasInfluencedBy(id; a2, e, attrs).
- 6. | wasInvalidatedBy(id; e,a,_t,attrs) | THEN wasInfluencedBy(id; e, a, attrs).
- 7. IF wasDerivedFrom(id; e2, e1, _a, _g, _u, attrs) THEN wasInfluencedBy(id; e2, e1, attrs). Here, _a, _g, _u MAY be placeholders -.
- 8. | wasAttributedTo(id; e,ag,attrs) | THEN wasInfluencedBy(id; e, ag, attrs).
- 9. IF wasAssociatedWith(id; a,ag,_pl,attrs) THEN wasInfluencedBy(id; a, ag, attrs). Here, _pl MAY be a placeholder -.
- 10. IF actedOnBehalfOf(id; ag2,ag1, a,attrs) THEN wasInfluencedBy(id; ag2, ag1, attrs).



a researcher

« **IF** some data was produced by a tool based on some input parameters, **THEN** this data derives from the input parameters »

PROV, how-to record/query?

Writing PROV statements

```
<Samples/Sample1/VCF/Sample1.hapcaller.g.vcf>
a prov:Entity;
prov:wasGeneratedBy <http://snakemake-provenance#activity-945311db-8f46-440d-ad05-e8c93832006e>;
prov:wasAttributedTo <#haplotypeCaller>;
rdfs:label "Samples/Sample1/VCF/Sample1.hapcaller.g.vcf";
crypto:sha512
"28df1599bd0053ac08ce195db5750cf5c5f3a05597695449a2acee49b72245aee290bbc3f9ffcbe0f3f43b8c07156a175a424a25f2de53c326906340081d1c7b"^^xsd:string;
prov:wasDerivedFrom <BED/capture.extended1000.bed>;
prov:wasDerivedFrom <Samples/Sample1/BAM/Sample1.final.bam>;
prov:wasDerivedFrom <../testdata/dbsnp_138.b37.chr22.recode.vcf.gz>;
prov:wasDerivedFrom <../testdata/human_g1k_v37.chr22.fasta>;
prov:wasDerivedFrom <../testdata/human_g1k_v37.chr22.dict>;
prov:wasDerivedFrom <Samples/Sample1/BAM/Sample1.final.bai>;
```

Writing PROV statements

```
<http://snakemake-provenance#activity-945311db-8f46-440d-ad05-e8c93832006e>
        a prov:Activity;
        rdfs:comment """
                gatk -Djava.io.tmpdir=Samples/Sample1/VCF -XX:ParallelGCThreads=5 -Xmx3g -T
               HaplotypeCaller
                                               -R ../testdata/human_g1k_v37.chr22.fasta
               --emitRefConfidence GVCF
                                                        -variant_index_type LINEAR
                -variant_index_parameter 128000
                                                                -stand_call_conf 30.0
                                                                                                -nct 1
                -rf ReadLength
                                        -minRead 0
                                                                -maxRead 10000
                                                                                        -S SILENT
               -L:capture, BED BED/capture.extended1000.bed
                                                                        -I
                Samples/Sample1/BAM/Sample1.final.bam
                                                                --dbsnp:dbsnp,VCF
                ../testdata/dbsnp_138.b37.chr22.recode.vcf.gz
                                                                        -0
                Samples/Sample1/VCF/Sample1.hapcaller.g.vcf
        prov:wasAssociatedWith <#haplotypeCaller> ;
        prov:startedAtTime "2018-04-04T16:19:57.054054"^^xsd:dateTime;
        prov:endedAtTime "2018-04-04T16:19:57.054076"^^xsd:dateTime;
        prov:used <BED/capture.extended1000.bed> ;
        prov:used <Samples/Sample1/BAM/Sample1.final.bam> ;
        prov:used <../testdata/dbsnp_138.b37.chr22.recode.vcf.gz> ;
        prov:used <gatkPresent.txt> ;
        prov:used <../testdata/human_g1k_v37.chr22.fasta> ;
        prov:used <../testdata/human_g1k_v37.chr22.dict> ;
        prov:used <Samples/Sample1/BAM/Sample1.final.bai> ;
```

Querying PROV graphs

CONSTRUCT {?x ?p ?y} WHERE {?x ?p ?y}

Query

```
NA12878.R1.ab.fastq
12878.R1.aa.fastq
NA12878.R2.aa.fastq
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                 10.10.10.346040400-00-50100.13:50.441090
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                   2016-06_JT15:10:23.522526
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                2016-06-28T08:19:29.354904
2016-06-28T08:19:33.81717
                                                                                  /galaxy/prod-galaxy/galaxy/galaxy-file
               Z138_ATGCCTAA_L006_R1 005.fastq.gz
Z138_ATGCCTAA_L006_R2 007/lesson.gta
/galaxy/prod-galaxy/galaxy/galaxy-files/galaxy-da. ts. dataset 119
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                       2016-06-30T09:500324505719:28.106
                                                               /galaxy/prod-galaxy/galaxy/galaxy-files/galaxy-datasets/0000/da
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                  2016-06-30709:509-2466282:20.94
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                              2016-06-29T15:10:48.879585
/galaxy/prod-galaxy/galaxy/galaxy/gites/gala:Lodeiaseta/99
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                              773c7f
11 BV6-29T15:12:03.03937
                                                                         Z138_ATGCCTAA_L006_R2_0000
                                                                                                 http://fr.symetric#toolshed.g2.bx.psu.
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                         nae pand data 2 (mapped reads in BAM format) 39.095104
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                 on data 3 and data 4 (mapped reads in BAM format)
                                                                                                                                         PairedSamples
                   /galaxy/prod-galaxy/galaxy/galaxy-files/galaxy-datasets/000/dataset_108pdatrsy/mel
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                         66129415:12:5319396130T09:56:54.47672
                                                                                               Z138_ATGCCTAA_L006_R1_004.fastq.gittp://fr.svm
Z138_Z4T38_CATGGCTAA_L006_R1_a307.stastq.gz http://fr.svm
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                         Sort on data 27<sup>2016-06-29T15:12:55.663322</sup>
                                                /galaxy/prod-galaxy/galaxy/galaxy-files/galaxy-datas 000/dataset 114.dat
/galaxy/prod-galaxy/galaxy/prod-galaxy/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-files/galaxy-fil
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                       2016-06-29T15:12:35.8677
                                                                                                                                                                                            GCCTAA_L006; Files 0002 fast quotes hed.g2.bx.psu.edu/repos/deglearon date of n date of state of state
```

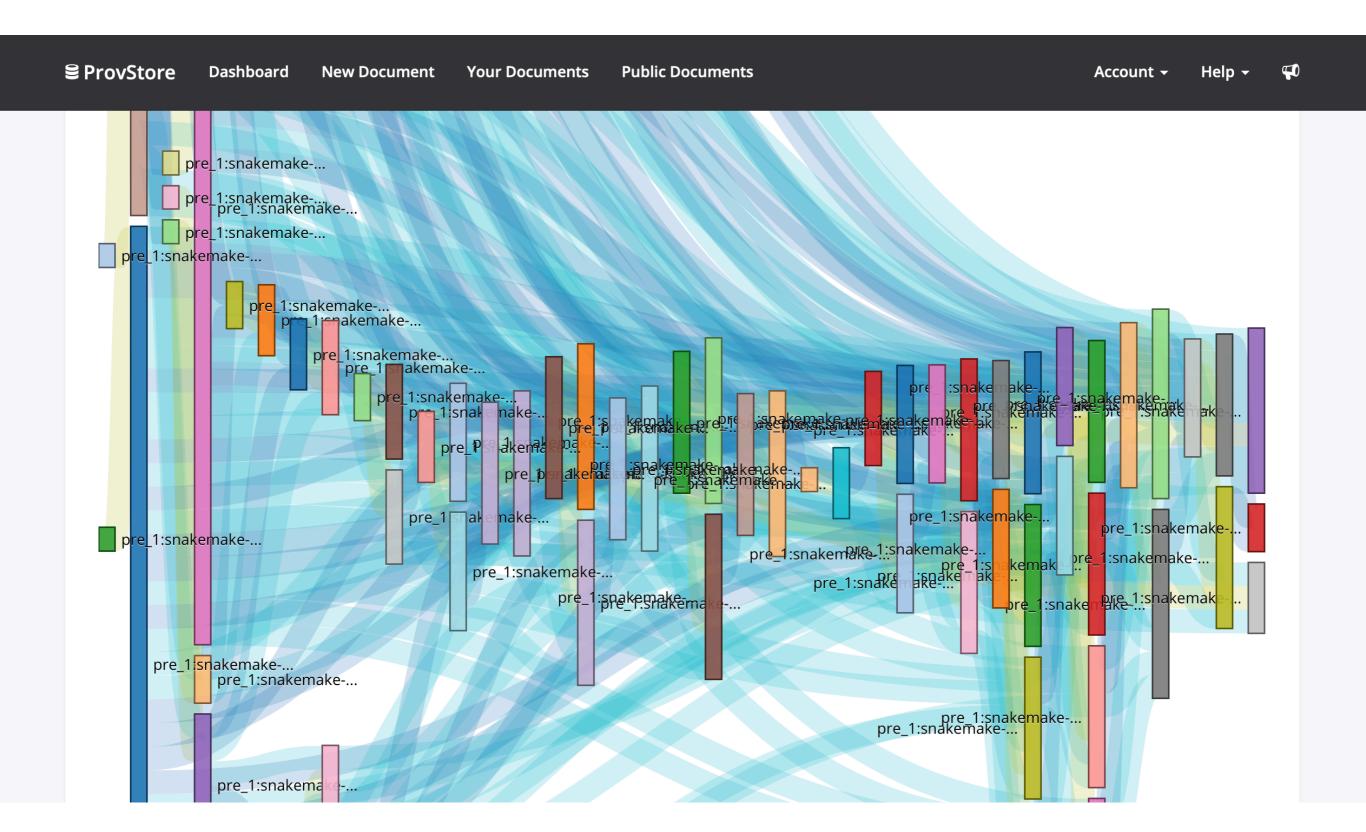
Querying PROV graphs

```
PREFIX prov: <a href="http://www.w3.org/ns/prov#">http://www.w3.org/ns/prov#>
CONSTRUCT {
    ?x prov:wasDerivedFrom ?y
} WHERE {
    ?x_uri prov:wasDerivedFrom ?y_uri .
    ?x_uri rdfs:label ?x .
    ?y_uri rdfs:label ?y .
}
```

Query

```
NA12878.R2.ab.fastq
                                                                         NA12892.R1.fastq
                                                                                                             NA12891.R1.fastq
                                                                                         NA12892.R2.fastq
412878.R1.aa.fastq
                                           NA12878.R1.ab.fastq
                                                                                                                              NA12891.R2.fastq
         NA12878.R2.aa.fastq
                                                Map with BWA-MEM on data 1 and data 2 (mapped reads in BAM format)
 Map with BWA-MEM on data 5 and data 7 (mapped reads in BAM format)
                                                                        Map with BWA-MEM on data 3 and data 4 (mapped reads in BAM format)
data 6 and data 8 (mapped reads in BAM format)
                                                                                                                      MergeSamFiles on data 15 and data 14: Merged BAM dataset
                                                                                                                                                                                           datasets/000/dataset_108.dat
                                                                                                                                                                           CTAA_L006_R1_004.fastq.gz
                                                                                                                                     Z138 ATGCCTAA
                                                                                                                  /galaxy/prod-galaxy/galaxy-files-galaxy
                                                                                                                  /galaxy/prod-galaxy/galaxy/galaxy-fil
                                                                                                                    Z138_AT GC TAA Loo
/galaxy/prod-galaxy/galaxy/prod/galaxy/galaxy/galaxy/galaxy/galaxy/galaxy/galaxy/galaxy-m
                                                                                                                                                                                 -files/galaxy-datasets/000/dataset_110.dat
                                                         Sort on data 17
                          Sort on data 18
                                                                                                                                                                                    sugalaxy-datasets/000/dataset_109.dat
06_R1_006.fastq.gz
drangsatasedat_112dat
assistation datasedat_112dat
                                                                                    Sort on data 27
                                                                                                   Sort on data 26
                                                                  Sort on data 16
                                                                                                    MPileup on data 21, data 20, and data 19 (log)
                                                                                                     MPileup on data 29, data 28, and data 21 (log)
            MPileup on data 21, data 20, and data 19
                                               MPileup on data 29, data 28, and data 21
```

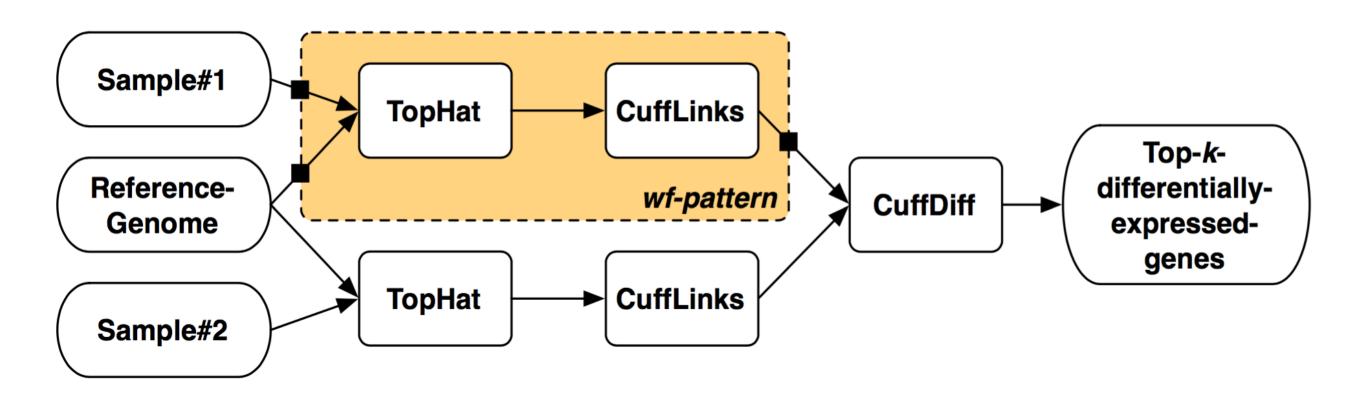
PROV store



Still open issues ...

Reuse instead of re-execution?

RNA-seq data analysis workflow



TopHat	1 sample	300 samples
Input data	2 x 17 Gb	10.2 Tb
1-core CPU	170 hours	5.9 years
32-cores CPU	32 hours	14 months
Output data	12 Gb	3.6 Tb

Compute and storage intensive

Avoid duplicated storage / computing

Is provenance enough for reuse?

```
a prov:Bundle, prov:Entity;
11
12
      prov:wasAttributedTo <#galaxy2prov>;
13
      prov:generatedAtTime "2016-04-14T18:18:37.000409"^^xsd:dateTime;
14
15
   <#72486b583fe152f0>
17
       a prov:Activity;
18
       prov:wasAssociatedWith <#cat1> ;
19
       prov:startedAtTime "2015-12-15T12:54:50.749845"^^xsd:dateTime;
       prov.endedA+Time "2015_12_15T12.55.57 016799"^^xcd.dateTime
```

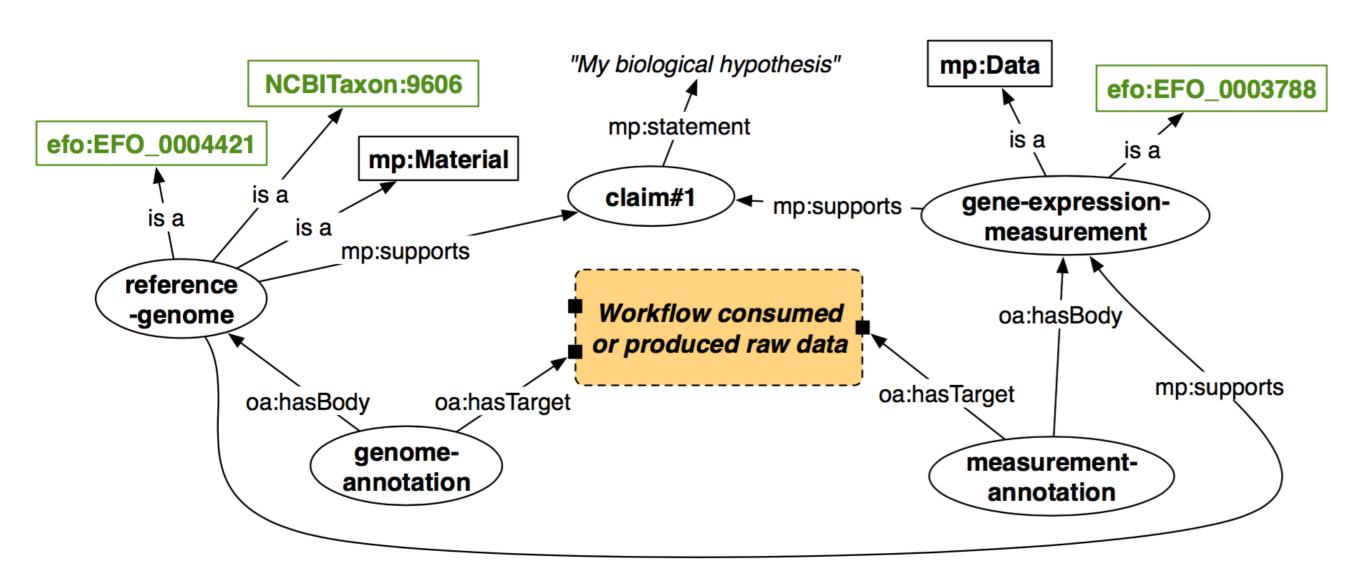
Too fine-grained No domain concepts

Visualise

```
Top-late of 45VT2 in the control of the control of
```

Human & machine-tractable report needed!

Annotated paper's "Material & Methods" with links to some workflow artifacts (algorithms, data).



Problem statement & objectives

Problem statement

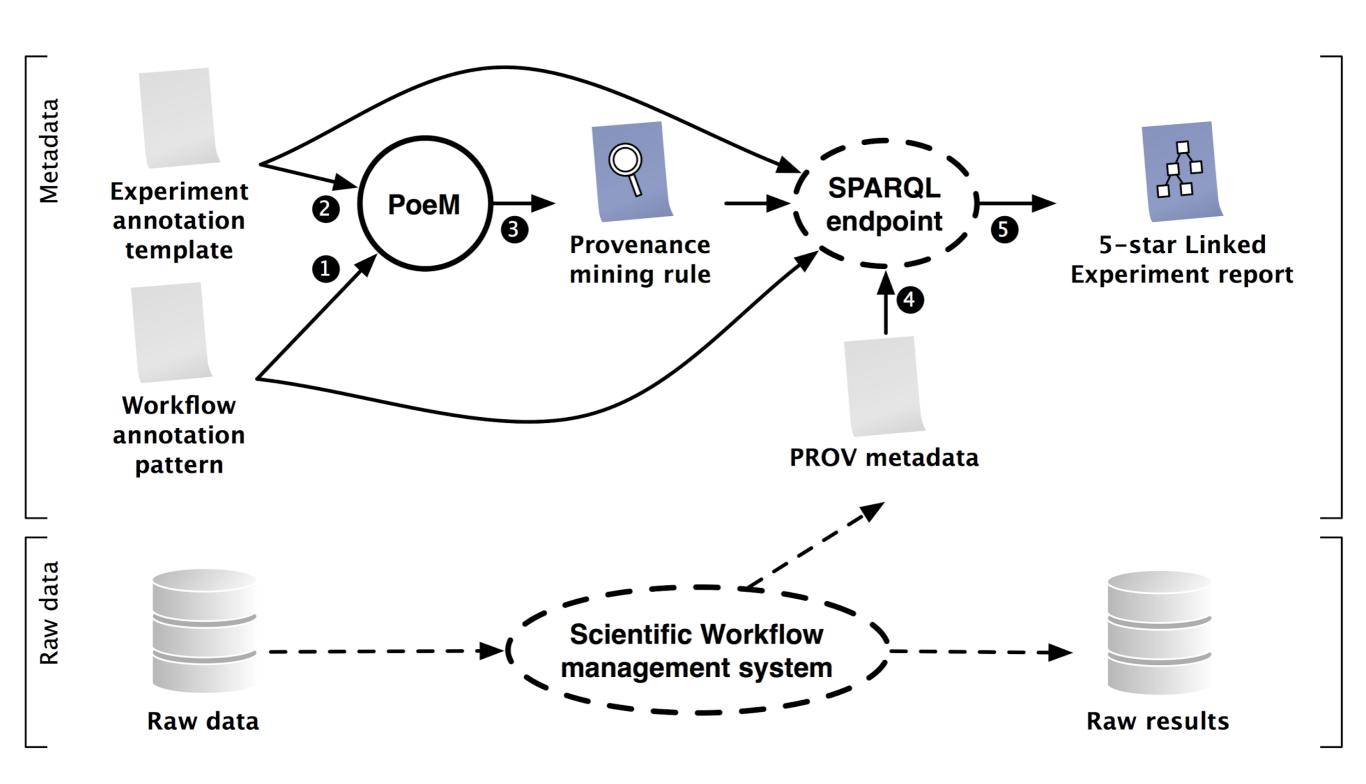
Scientific workflows produce massive raw results. Their publication into curated query-able linked data repositories requires lot of time and expertise.

Can we exploit provenance traces to ease the publication of scientific results as Linked Data?

Objectives

- (1)Leverage annotated workflow patterns to generate **provenance mining rules**.
- (2) Refine provenance traces into linked experiment reports.

Approach



A. Gaignard, H. Skaf-Molli, A. Bihouée: **From Scientific Workflow Patterns to 5-star Linked Open Data**. 8th USENIX Workshop on the Theory and Practice of Provenance, TaPP 2016.

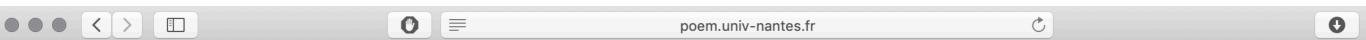
PoeM: generating PrOvEnance Mining rules 3

```
Input : W : Workflow annotated pattern \mathbf{0}, S_1 : First step of W, S_2 : Last step of W, A : Annotation template \mathbf{0}.
```

Output: Rule: Provenance mining rule.

```
begin
       IN_{S1} \leftarrow getInputs(S_1)
                                                                                  SPAROL Property path
       OUT_{S2} \leftarrow getOutputs(S_2)
3
                                                                              SPARQL Basic graph pattern
4
       provGraph \leftarrow genDataLineage(OUT_{S2}, IN_{S1})
5
       reportGraph \leftarrow bindReportTargets(provGraph, A)
6
7
                                                                                SPARQL Construct query
       Rule \leftarrow \underbrace{provGraph.edge_1 \land ... \land provGraph.edge_N}_{\text{fig. 1}}
8
                                        \overline{reportGraph}
```





PoeM: Provenance Mining for scientific linked data publishing

Contact: Alban Gaignard, Hala Skaf, Audrey Bihouee, {firstname.lastname}@univ-nantes.fr.

For demonstration purpose only.

This web page illustrates our semi-automated approach for mining provenance traces and assembling linked experiment reports. PoeM generates Semantic Web rules from (i) annotated workflow patterns, (ii) domain-specific annotations, and (iii) provenance traces of a workflow run. The rules finally match provenance subgraphs and produce linked experiment reports.

We illustrate our approach in the context of an RNAseq bioinformatics workflow .

This work reuses existing linked open vocabularies, namely PROV-O, P-PLAN, Micropublications Ontology, Experimental Factors Ontology, and EDAM.

This demo is supported by the Corese Semantic Web factory, Apache Jena, D3.js, Codemirror.js and Twitter Bootstrap.

Show input annotations

Show provenance trace

Show generated rule

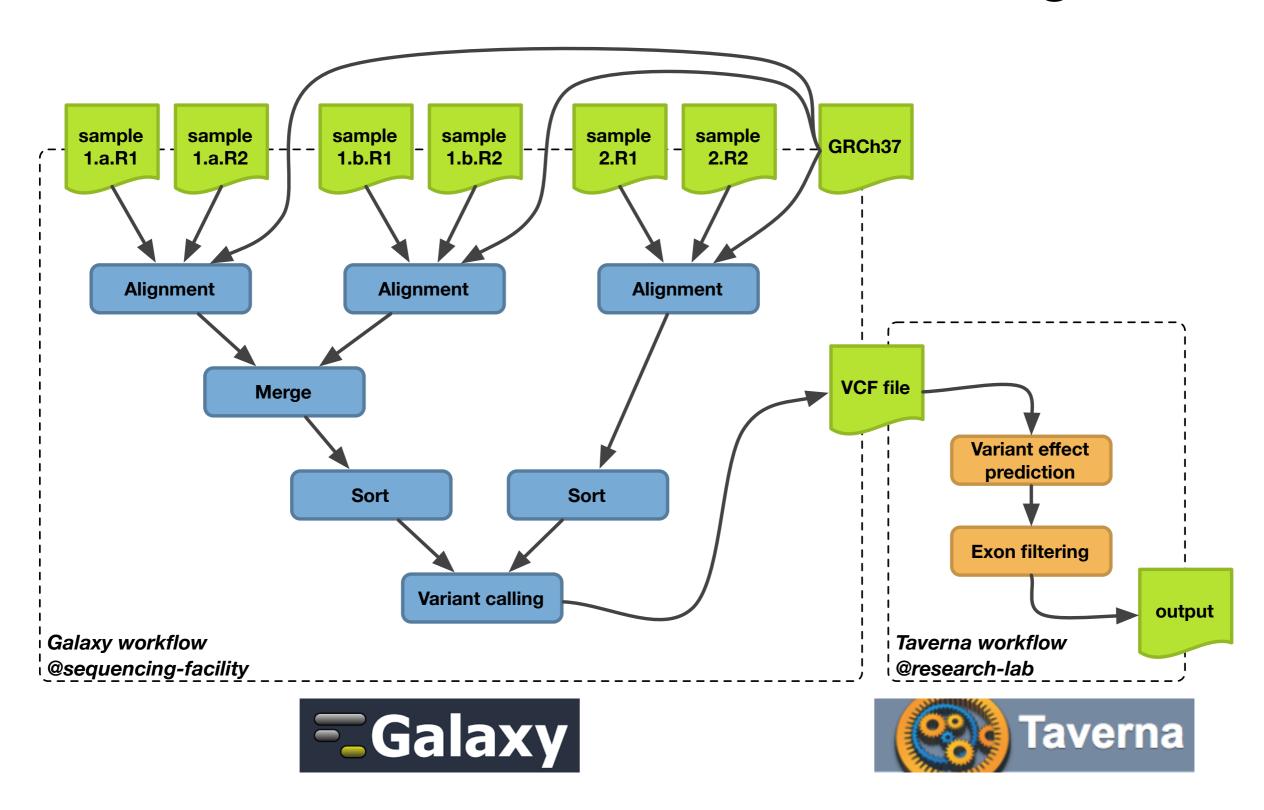
Show resulting report

Resulting linked experiment report

```
1  @prefix void: <http://rdfs.org/ns/void#> .
2  @prefix mp: <http://purl.org/mp/> .
3  @prefix edam: <http://edamontology.org/> .
4  @prefix sym: <http://fr.symetric/vocab#> .
5  @prefix xsd: <http://www.w3.org/2001/XMLSchema#> .
6  @prefix rdfs: <http://www.w3.org/2000/01/rdf-schema#> .
7  @prefix p-plan: <http://purl.org/net/p-plan#> .
8  @prefix efo: <http://www.ebi.ac.uk/efo/> .
9  @prefix ncbitaxon: <http://purl.org/obo/owl/NCBITaxon> .
10  @prefix oa: <http://www.w3.org/ns/oa#> .
```

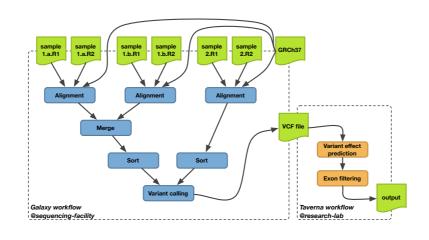
Provenance in **multi-site** studies?

Multi-site studies → ≠ workflow engines!



Scattered provenance capture?

Provenance issues



« Which alignment algorithm was used when predicting these effects? »

« A new version of a reference genome is available, which genome was used when predicting these phenotypes? »

Need for an overall tracking of provenance over both Galaxy and Taverna workflows!

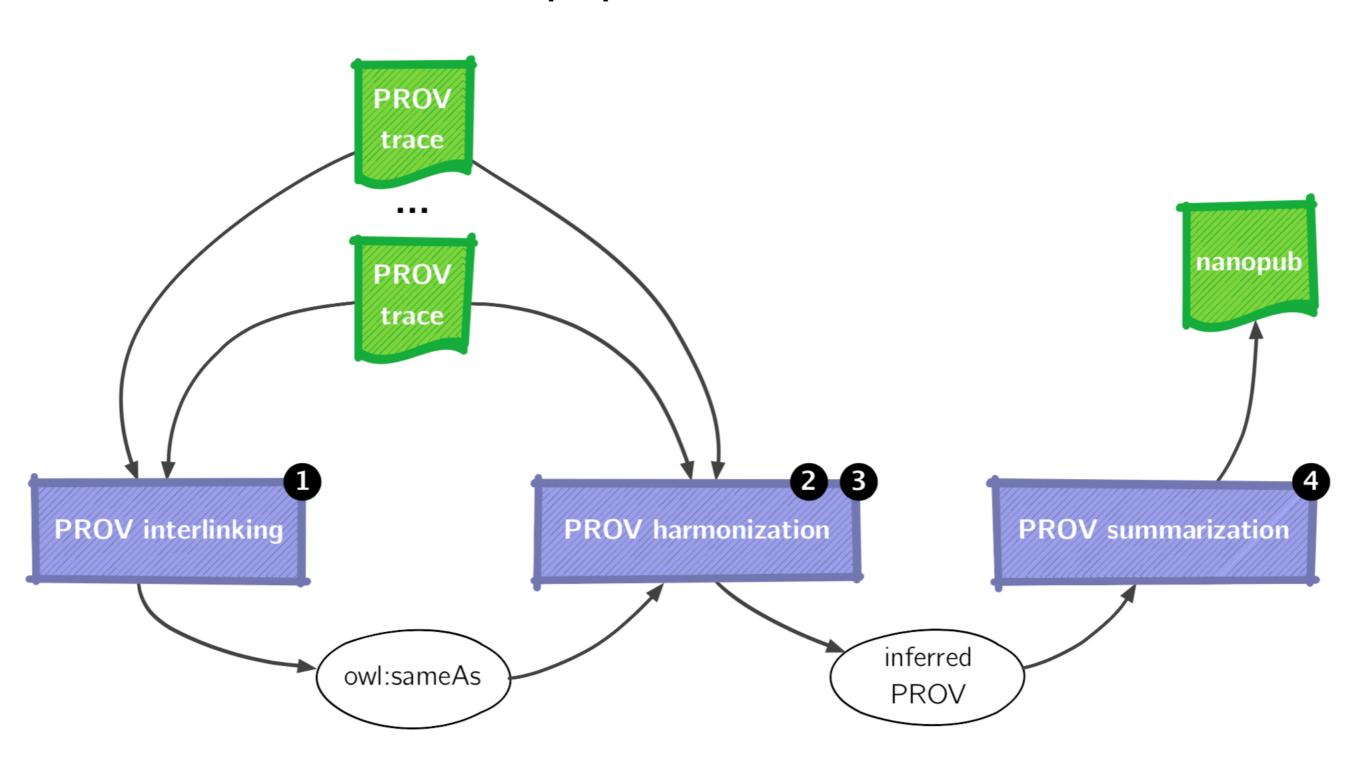
Provenance « heterogeneity »

Galaxy PROV predicates	counts
prov:wasDerivedFrom	118
rdf:type	76
rdfs:label	62
prov:used	61
prov:wasAttributedTo	34
prov:wasGeneratedBy	33
prov:endedAtTime	26
prov:startedAtTime	26
prov:wasAssociatedWith	26
prov:generatedAtTime	1

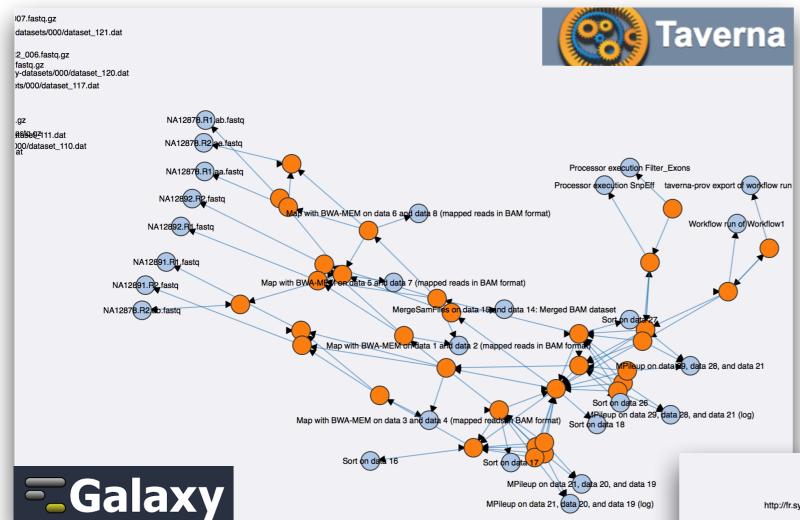
How to reconcile these provenance traces?

Taverna PROV predicates	counts
rdf:type	54
rdfs:label	13
prov:atTime	8
wfprov:describedByParameter	6
rdfs:comment	6
prov:hadRole	6
prov:activity	5
dcterms:hasPart	4
prov:agent	4
prov:endedAtTime	4
prov:hadPlan	4
prov:qualifiedAssociation	4
prov:qualifiedEnd	4
prov:qualifiedStart	4
prov:startedAtTime	4
prov:wasAssociatedWith	4
tavernaprov:content	3
wfprov:usedInput	3
wfprov:wasEnactedBy	3
wfprov:wasOutputFrom	3

Approach

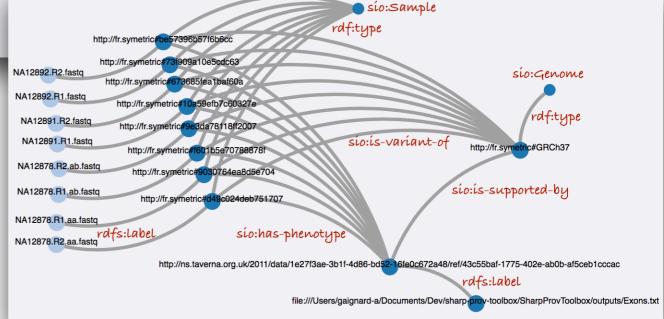


Results



Linked experiment report with Nanopublication, domain-specific concepts

Reconciled provenance as an « influence graph »



Summary

Take home message & perspectives

- Scientific Workflows → automation, abstraction, provenance
- Standards for provenance representation and reasoning

- Better handle multi-site studies (ESWC'17 satelite event paper)
- Linked experiment reports = contextualized and summarized provenance (TaPP'16 paper)

- Distributed data analysis → Distributed provenance, reasoning?
- Learning patterns in provenance graphs?
- Predicting domain-specific annotation for workflow results?
 What about trust?

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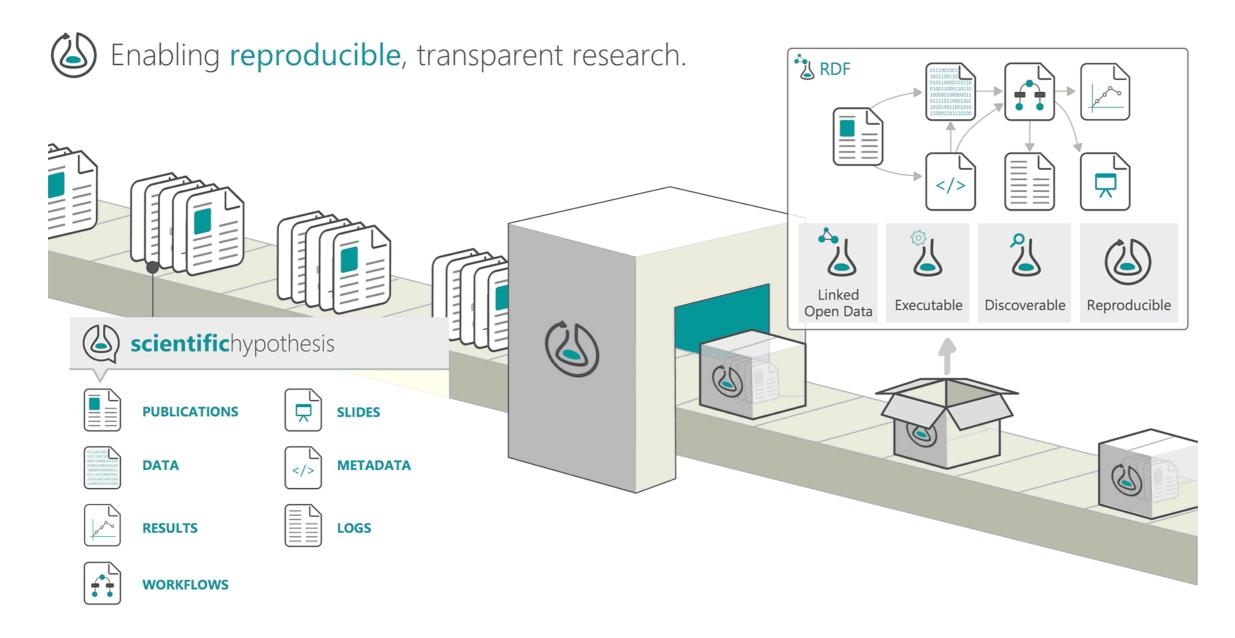






Backup slides

Research Objects



Sean Bechhofer, Iain Buchan, David De Roure, Paolo Missier, John Ainsworth, Jiten Bhagat, Phillip Couch, Don Cruickshank, Mark Delderfield, Ian Dunlop, Matthew Gamble, Danius Michaelides, Stuart Owen, David Newman, Shoaib Sufi, Carole Goble (2013) **Why Linked Data is Not Enough for Scientists**, Future Generation Computer Systems **29**(2), February 2013, Pages 599-611, ISSN 0167-739X, https://doi.org/10.1016/j.future.2011.08.004

Khalid Belhajjame, Jun Zhao, Daniel Garijo, Matthew Gamble, Kristina Hettne, Raul Palma, Eleni Mina, Oscar Corcho, José Manuel Gómez-Pérez, Sean Bechhofer, Graham Klyne, Carole Goble (2015) **Using a suite of ontologies for preserving workflow-centric research objects**, Web Semantics: Science, Services and Agents on the World Wide Web, https://doi.org/10.1016/j.websem.2015.01.003

schema.org Action

Action

Canonical URL: http://schema.org/Action

Thing > Action

An action performed by a direct agent and indirect participants upon a direct object. Optionally happens at a location with the help of an inanimate instrument. The execution of the action may produce a result. Specific action sub-type documentation specifies the exact expectation of each argument/role.

See also blog post and Actions overview document.

Usage: Between 100 and 1000 domains

[more...]

Property	Expected Type	Description
Properties from Action		
actionStatus	ActionStatusType	Indicates the current disposition of the Action.
agent	Organization or Person	The direct performer or driver of the action (animate or inanimate). e.g. <i>John</i> wrote a book.
endTime	<u>DateTime</u>	The endTime of something. For a reserved event or service (e.g. FoodEstablishmentReservation), the time that it is expected to end. For actions that span a period of time, when the action was performed. e.g. John wrote a book from January to <i>December</i> . Note that Event uses startDate/endDate instead of
		startTime/endTime, even when describing dates with times. This situation may be clarified in future revisions.

error	Thing	For failed actions, more information on the cause of the failure.
instrument	Thing	The object that helped the agent perform the action. e.g. John wrote a book with <i>a pen</i> .
location	Place or PostalAddress or Text	The location of for example where the event is happening, an organization is located, or where an action takes place.
object	Thing	The object upon which the action is carried out, whose state is kept intact or changed. Also known as the semantic roles patient, affected or undergoer (which change their state) or theme (which doesn't). e.g. John read <i>a book</i> .
participant	Organization or Person	Other co-agents that participated in the action indirectly. e.g. John wrote a book with <i>Steve</i> .
result	Thing	The result produced in the action. e.g. John wrote a book.
<u>startTime</u>	DateTime	The startTime of something. For a reserved event or service (e.g. FoodEstablishmentReservation), the time that it is expected to start. For actions that span a period of time, when the action was performed. e.g. John wrote a book from <i>January</i> to December.
		Note that Event uses startDate/endDate instead of startTime/endTime, even when describing dates with times. This situation may be clarified in future revisions.
target	EntryPoint	Indicates a target EntryPoint for an Action.