



my experiment

Scientific Workflow Management System





Taverna, Biocatalogue, myExperiment, and the provenance of it all: forward-looking while looking back

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with additional material kindly provided by:

Prof. Dave DeRoure, Prof. Luc Moreau, Univ. of Southampton, UK

Andrea Wiggins, Syracuse University, NY

Part I: models and technology for e-science

- 1. Addressing the needs of the e-scientist:
 - -Workflow as a model of experimental science
 - Taverna

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- Services as building blocks
- Biocatalogue
- 2. Scaling up along the social dimension:
 - towards open, collaborative science
 - myExperiment

Part II: Explaining and Preserving experimental outcomes

- Data provenance support in Taverna
- provenance for open science: the OPM vision

Outline



What is the myGrid Project?

- UK e-Science pilot project since 2001.
- Centred at Manchester, Southampton and the EMBL-EBI
- Part of Open Middleware Infrastructure Institute UK http://www.omii.ac.uk.
- Mixture of developers, bioinformaticians and researchers
- An alliance of contributing projects and partners
- Open source development and content LGPL or BSD
- Infrastructure
- We don't own any resources (apart from catalogues)
- Or a Grid.



Workflows: E. Science laboris



- Pipeline processing
- Automated processing
- Repetitive and mundane boring stuff made easier, reliable and adaptable.
- Shield interoperability horror
- Trackable results
- Agile software development
- Big science, small science & collaborative science



Workflow as data integrator





Workflow as data integrator



LOIF INCENING, July 2009 - P. Missier



Data-driven computation in Taverna





Data-driven computation in Taverna



Data-driven computation in Taverna



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ESIP meeting, Santa Barbara, CA, July 2009 - P. Missier



What do Scientists use Taverna for?

Astronomy, Music, Meteorology



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Workflows operating over Grid Infrastructure



KnowARC integrated with Taverna" application prototype to use Taverna as direct interface to Grid resources running ARC.

http://www.knowarc.eu



Open source grid software infrastructure aimed at enabling multi-institutional data sharing and analysis. Underpins caBIG. Taverna links together caGrid resources.

http://cagrid.org/



Europe's leading grid computing project, Piloted Taverna over EGEE gLite services http://www.eu-egee.org/



[Foster 2005]



- Service-oriented applications
 - Applications components of workflows
 - Compose applications into workflows
 - Incorporate workflows into applications

- Service-oriented Grid
 Infrastructure
 - Provision physical resources to support application workflows
 - Coordinate resources through workflows



Who else is in this space?





Workflow-based experimentation lifecycle



Workflow-based experimentation lifecycle



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Taverna

Graphical Workbench For Professionals

Plug-in architecture Nested Workflows Drag and Drop Wiring together



Rapidly incorporate new service without coding. Not restricted to predetermined services

Access to local and remote resources and analysis tools 3500+ service operations available when start up



Services Mutability

implications for

sustainability, accountability and reproducability

- Reliability and robustness of workflows depends on the reliability and robustness of the components
- In house service support
- Services in constant and (silent) change.
- Versioning.
- Workflow Decay
- Monitoring and Repair of wrappers, shims and service substitutions.





BioCatalogue



http://www.biocatalogue.org

http://beta.biocatalogue.org

Professor Carole Goble University of Manchester, UK Director myGrid Consortium

28 April 2009, Boston MA

Data curation + process curation=data integration + science Briefings in Bioinformatics, doi:10.1093/bib/bbn034 (Dec., 2008) Carole Goble, Robert Stevens, Duncan Hull, Katy Wolstencroft and Rodrigo Lopez



The short story

- Public, Curated Catalogue of Life Science Web Services
- Register, Find, Curate Web Services
- Community-sourced annotation, expert oversee
- Open content
- Open platform with open REST interfaces
- Web 2.0 site and development.
- Open source code base.
- Started June 2008. In first beta phase.
- Launched June 2009 at ISMB.
- www.biocatalogue.org



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 curation involves substantial human effort why would it happen at all?







Curation

- Just enough just in time
- Universal annotation scheme
- Mixed: Free text, Tags, controlled vocabs, community ontologies
- Community sourced tags, comments, recommendations
- Expert curation ontology-based annotation. myGrid OWL Ontology
- Automated WSDL ripping and analytics
- Automated monitoring & testing
- Partner feeds (e.g. myExperiment)
- Update feeds to users

Annotations: 192 灵	32 🔊	30 🙇	130 🝙
e executable when	by user: <u>F</u>	r <u>anck</u> (2 mo	onths ago) Service status: Offline (last
			checked about 1 hour ago)
Annotations: 5	3	2 🦉	3 0 🔒
from service descri	ption docu	ment (5 m	onths ago)

Today: 14902 annotations (provider, user, registries) KEGG: 1433 annotations

Service monitoring

The EMBRACE Service Registry is a collection of life-science web services with built-in service testing.

BioCatalogue

"The Life Science Web Services Registry

This site is a prelude to the internationally supported **BioCatalogue** system that will collect, store, validate, and make available web-services in the biosciences. This registry is mainly meant for the EU projects EMBRACE, BioSapiens and ENFIN, but other users are welcome too. As a potential web service user, you can search or browse the registry for services that match your needs. Furthermore, each entry includes live test data, showing



Latest service updates

INB:inb.bsc.es:runWUTBlas

3 hours ago status changed to FAILED



INB:inb.bsc.es:runWUBlastr

6 hours ago status changed to FAILED



INB:inb.bsc.es:getPDBIDsFi

8 hours ago status changed to FAILED





















Scientific collaboration

Scientific Collaboration Requirements

Shared goals

- Establishes focus of research
- Shared research resources
 - Both social and artifactual
 - Social aspects include training and community socialization



Source: **Andrea Wiggins**, talk given at the School of Computer Science, University of Manchester, UK, June 18th, 2009

Historical Research Artifacts

- Letters, Books, Journals, Lectures
- Also technologies: methods, instrumentation
- Sharing?
 - Recordkeeping is not always a researcher's main priority
 - Without records, there's not much to share except the research outputs



Source: **Andrea Wiggins**, talk given at the School of Computer Science, University of Manchester, UK, June 18th, 2009

Today's Research Artifacts

- Large scale datasets, scripts, software, workflows, papers, images, video, audio, annotations, ephemera, web sites...
 - "Research objects" bundling all the pieces together
 - Hybrids of boundary objects and touchstones
- Technologies -> scientific revolution!
 - Open science



http://www.flickr.com/photos/smiteme/2379630899/

Source: **Andrea Wiggins**, talk given at the School of Computer Science, University of Manchester, UK, June 18th, 2009



The Selfish (or Self-interested) Scientist

"A biologist would rather share their toothbrush than their gene name" Mike Ashburner and others Professor Constice

Professor Genetics, University of Cambridge,\UK

"Data mining: my data's mine and your data's mine"



The potential for collaboration

Aancheste

• What:

- processes: "materials and methods" \rightarrow workflows
- -data: unlikely, and certainly not until published
- metadata (annotations, provenance traces...): ??
- When:
 - for contributors: part of publication process
 - some publishers demand public data and repeatable experiments
 - for consumers: reuse as part of experiment design

• Where and how:

- a meeting point for a virtual community
- -Web 2.0 style of interaction
- -voluntary, incentive-based contributions



Traditional sharing is asymmetric:

- Producer-consumer:
 - from service providers to workflow designers
 - Biocatalogue

Open science is symmetric:

- Peer-based
 - sharing of workflows as complex processes
 - myExperiment

myGrid combines both paradigms:

- Service space "closed under composition":
 - workflows are compositions of services
 - \hdots and they are services themselves
- Scientists become providers
 - of conceptual process models
 - and of executable services, as well! 27 ESIP meeting, Santa Barbara, CA, July 2009 - P. Missier


Publishing for collaboration





Publishing for collaboration



Collaboration in the workflow space





Collaboration in the workflow space



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Competitive advantage. Academic vanity. Adoption. Reputation.

Scrutiny. Being scooped. Misinterpretation. Reputation.

Taverna 1 workflow

🕕 Original Uploader



🕕 License

All versions of this Workflow are licensed under the Creative Commons Attribution-Share Alike 3.0 License. Credits (2) (People/Groups)
 Saeedeh
 Paul Fisher
 Attributions (1) (Workflows/Files)

HUMAN Microarray CEL file to candidate pathways

🕕 Tags (5)

Original Uploader tags

e.coli | kegg | Kegg Pathways | pathways | pubmed

my experiment

- Getting author to take credit!
- Creating a culture of attribution.
- Attribution and credit chains.
- Licensing and rights protection



Incentive and reputation

- Strong sense of persistent identity.
- Building reputation and boasting opportunities.
- Cult of the individual.
- High visibility to the participant and the community.
- Downloads & Views.
- Instrumentation and automated analysis.
- Feedback.
- Liability policy.







Reuse, Recycling, Repurposing Cross-fertilization

- Paul writes workflows for identifying biological pathways implicated in resistance to Trypanosomiasis in cattle
- Paul meets Jo. Jo is investigating Whipworm in mouse.
- Jo reuses one of Paul's workflow without change.
- Jo identifies the biological pathways involved in sex dependence in the mouse model, believed to be involved in the ability of mice to expel the parasite.
- Previously a manual two year study by Jo had failed to do this.









my experiment

www.myexperiment.org⁻

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Socially share, discover and reuse workflows and other methods.

Cooperative bazaar.



Sunday 10th May: 1748 registered users, 143 groups, 669 workflows, 197 files, 52 packs 56 different countries. Top 4: UK, US, The Netherlands, Germany





Created: 17/07/08 @ 21:06:12 | Last updated: 20/07/08 @ 15:46:51

Everything to get started with Taverna 1.7.1

16 items in this pack

Comments: 0 | Viewed internally: 215 times | Downloaded internally: 47 times

Tags:

example | introduction | tutorial

myoynoriment

Packs

Created: 17/07/08 @ 21:06:12 | Last updated: 20/07/08 @ 15:46:51

Everything to get started with Taverna 1.7.1

Towards Genotype-Phenotype Correlations

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16

Created: 08/04/09 @ 13:14:54 | Last updated: 08/04/09 @ 13:16:23

It is increasingly common to combine Microarray and Quantitative Trait Loci data to aid the search for candidate genes responsible for phenotypic variation. Workflows provide a means of systematically processing these large datasets and also represent a framework for the re-use and the explicit declaration of experimental methods. In this pack is a paper which describes the issues facing the manual analysis of microarray and QTL data for the discovery of candidate genes underlying complex phe...

19 items in this pack

Comments: 0 | Viewed internally: 4 times | Downloaded internally: 0 times

Tags:

affymetrix | african trypanosomiasis | cattle | data-driven | disease | entrez | genotype | Kegg Pathways | KeggID | link-integration | microarray | mouse | pathway | pathway-driven | phenotype | sleeping sickness | swissprot | uniprot | web services

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	Comments: 0 Viewed internally: 60 times Downloaded inte	rnally: 4 times

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my experiment





15,902 Absolute Unique Visitors

Collaboration in the workflow space





Technical implications of open science

- Process interoperability
 - SOA principles: runtime interoperability
 - -but, still no common workflow model after all!
- Data interoperability
 - Traditional heterogeneity / integration issues
 - Dataspaces
 - LinkedData

- Aggregation: creating logical units
 - process + inputs + outputs + provenance traces + …
 - Research Objects
- Provenance interoperability



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Provenance of data

 "It would include details of the processes that produced electronic data as far back as the beginning of time or at least the epoch of provenance awareness."



Luc Moreau, Paul Groth, Simon Miles, Javier Vazquez-Salceda, John Ibbotson, Sheng Jiang, Steve Munroe, Omer Rana, Andreas Schreiber, Victor Tan, Laszlo Varga, *The provenance of electronic data,* Communications of the ACM, Vol. 51 No. 4, Pages 52-58



Analysis of process results

- Causal relations:
 - *More which pathway sets come from which gene sets?*
 - which processes contributed to producing this image?
 - which process(es) caused this data to be incorrect?
 - which data caused this process to fail?
- Process and data analytics:
 - show me the variations in output in relation to an input parameter sweep (multiple process runs)
 - how often has my favourite service been executed?
 - on what inputs?
 - who produced this data?
 - how often does this pathway turn up when the input genes range over a certain set S?





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Taverna + provenance

- Taverna type system: strings + nested lists —"cat", ["cat", "dog"], [["cat", "dog"], ["large", "small"]]
- Taverna dataflow model: data-driven execution
 services activate when input is ready
- Workflow provenance: a detailed trace of workflow execution
 - which services were executed
 - when
 - inputs used, outputs produced



Taverna + provenance

- The University of Mancheste
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Taverna dataflow model + provenance traces can be a powerful combination



Forms of provenance ...

Focus is on the data: the observable outcomes of a process

	raw provenance metadata	provenance metadata + interpretation framework
design	 process structure (workflow graph) history of process composition - reuse process versions 	 service annotations: ex. get_pathways_by_genes who created /edited: attribution why: purpose, intent
execution	<pre>process events: - service invocation - data production / consumption - causal dependency graphs ex.: - list_of_geneIDList = [a, b, c] - paths_per_gene = [[d,e,f], [g,h,j]] in run #32</pre>	 data annotations, results interpretation in terms of conceptual data model: set of pathways → gene sets



MANCHESTER 1824 ... and their uses and associated challenges

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	raw provenance metadata	provenance metadata + interpretation framework
design	 exploiting semantic properties of the process structure to improve provenance exploitation 	 semantic-based search of process space
	 exploring process space across versions and structural similarities 	
	 graph matching 	
execution	 enabling partial re-runs of resource-intensive workflows 	 semantic-based query answering over annotated traces
	 storing very large provenance traces that accumulate over time 	
	- efficient query over large traces	
	- presentation of query answers	



MANCHESTER 1824 ... and their uses and associated challenges

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MANCHESTER 1824 ... and their uses and associated challenges

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Querying provenance traces

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Lineage queries involve traversing a provenance graph from bottom to top





- In most approaches, the originating process are not used for querying
- consequence: query requires provenance graph traversal
 - large traces → computationally complex
 - view materialization used in practice to get around the computational complexity



Querying provenance graphs in Taverna

 Users are rarely interested in the complete provenance graph – noisy, possibly large, difficult to navigate



select interesting outputs select interesting processors

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This results in a more efficient lineage query algorithm that scales to large provenance graphs 49

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Querying provenance graphs in Taverna

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MANCHESTER Provenance interoperability for open science

OPM: the Open Provenance Model



Provenance Across Applications



Adapted from Luc Moreau's slides: "The Open Provenance Model" (Univ. of Southampton, UK), 2009

Provenance Across Applications



Adapted from Luc Moreau's slides: "The Open Provenance Model" (Univ. of Southampton, UK), 2009

Illustration



- Process "used" artifacts and "generated" artifact
- Edge "roles" indicate the function of the artifact with respect to the process (akin to function parameters)
- Edges and nodes can be typed

Causation chain:

- P was caused by A1 and A2
- A3 and A4 were caused by P
- Does it mean that A3 and A4 were caused by A1 and A2?

From Luc Moreau's slides set: "The Open Provenance Model" (Univ. of Southampton, UK), 2009

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Integrated OPM generation in Taverna

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Integrated OPM generation in Taverna





the answer to any TP query can be viewed as an OPM graph

Workflow Inputs

encoded as RDF/XML using the Tupelo provenance API (NCSA)





More information on OPM

- The OPM wiki:
 - http://twiki.ipaw.info/bin/view/OPM/
 - open to discussions and contributions
 - please read the governance doc
- The 3rd provenance challenge:
 - produce and export OPM graphs
 - interoperable XML and RDF serializations
 - import and query third party graphs
 - <u>http://twiki.ipaw.info/bin/view/Challenge/ThirdProvenanceChallenge</u>
 - The University of Manchester's contribution to the challenge:
 - <u>http://twiki.ipaw.info/bin/view/Challenge/UoM</u>
 - -latest meeting held in June, 2009 (Amsterdam)

MANCHESTER 1824 From knowledge capture to exploitation

answering user questions effectively

(using provenance + semantics infrastructure)

- has a similar investigation been undertaken before? when, by whom? what was the outcome?
- have alternative services being used? to what effect?
- what have been the users' decisions, and why?

Enabling collaborative science:

- provide users with recommendations on the next steps in their session, based on analysis of their past actions;
- cluster users within a group based on their common interests, observed through the choices they make during the sessions
- promote socal/scientific networking
 - a "blog the lab" flavour

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From knowledge capture to exploitation

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The Provenir ontology

- Upper ontology with for domain-specific extensions
- OWL, designed for reasoning and RDF queries



Satya S. Sahoo, Roger S. Barga, Jonathan Goldstein, Amit P. Sheth, *Where did you come from...Where did you go?" An Algebra and RDF Query Engine for Provenance*, TR-2009-03, Kno.e.sis Center, CSE Dept., Wright State University, Dayton⁷, OH, March, 2009



Upcoming events

SWPM 2009:

The First International Workshop on the Role of Semantic Web in Provenance Management

http://wiki.knoesis.org/index.php/SWPM-2009

Co-located with ISWC'09, October 25/26 2009, Washington D.C., USA Submission Deadline: Friday, July 31, 2009

Special issue of **Future Generation Computer Systems Journal** (FGCS) on the third provenance challenge (to be announced)

expected deadline: Dec., 2009



Provenance:

- automated metadata collection and processing
- 1. data management angle: "logs with a proper data model"
- storage and query issues
- interoperability

2. social angle: attribution chain for experimental artifacts

- processes, data, annotations
- myExperiment packs \rightarrow Research Objects



Selected literature on provenance

- P. Buneman, S. Khanna, W. Chiew Tan, Why and Where: A Characterization of Data Provenance, Procs. ICDT, 2001
- Susan B. Davidson and Juliana Freire, *Provenance and scientific workflows:* challenges and opportunities, Procs. SIGMOD, 2008
- Z. Bao and S. Cohen-Boulakia and S. Davidson and A. Eyal and S. Khanna, *Differencing Provenance in Scientific Workflows*, Procs. ICDE, 2009
- Luc Moreau, Paul Groth, Simon Miles, Javier Vazquez-Salceda, John Ibbotson, Sheng Jiang, Steve Munroe, Omer Rana, Andreas Schreiber, Victor Tan, Laszlo Varga, *The provenance of electronic data*, Communications of the ACM, Vol. 51 No. 4, Pages 52-58, 2008
- P. Missier, K. Belhajjame, J. Zhao, C. Goble, *Data lineage model for Taverna* workflows with lightweight annotation requirements, Procs. IPAW 2008
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- R. S. Barga and L. A. Digiampietri, *Automatic capture and efficient storage of* e-Science experiment provenance, Concurrency and Computation: Practice and Experience, Vol. 20 no. 8, 2008