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The Taverna Workbench: Integrating and analysing biological and clinical data with computerised workflows

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Outline

- Why workflows are important
- WSDL, REST and other Workflow Services
- Getting started with Taverna
- Taverna in Use
- Sharing and reusing workflows
- Workflows on servers, grids and clouds
- Taverna Future Plans







www.taverna.org.uk



- 21st century is the century of information
- eGovernment
- World bank data
- Climate change data
- Large scale physics
 - Large Hadron collider
 - Astronomy
- 'Omics data



Next Gen Sequencing





Where is the data?

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- In repositories run by major service providers (e.g. NCBI, EBI)
- Group/Institute web sites
- On ftp servers
- In local project stores



National Center for Biotechnology Information (USA)

Cambridge, UK

- Few defined formats^{Tokyo, Japan}
- Inconsistent metadata^{DIO}







Lots of Resources







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- Data resources databases, analysis tools
- Computational power servers, clusters, cloud/grid
- Researchers and collaborators skills and expertise need to be shared and exchanged Analysis scripts need to be shared and exchanged







What that means for Bioinformatics



- Incompatible input and output formats
- Analysis of large data sets by multiple researchers
- Difficult to record parameter selections
- Difficult to reproduce analyses





Workflow as a Solution

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- Automating the process
- Sophisticated analysis pipelines
- A set of services to analyse or manage data (either local or remote)
- Data flow through services
- Control of service invocation
- Iteration







What is a Workflow?



Describes *what* you want to do, rather than *how* you want to do it Simple language specifies how processes fit

together









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Workflows are ideal for...

- High throughput analysis
 - Transcriptomics, proteomics, next gen sequencing
- Data integration, data interoperation
- Data management
 - Model construction
 - Data format manipulation
 - Database population
 - Semantic integration
 - Visualisation





Promoting Reproducible Research

Informatics involves

- Complex, multi-step analyses
- Lots of data as inputs
- Lots of data generated
- Workflows encapsulate the methods and parameters
- Workflows allow you to visualise the methods





Preventing Irreproducible Research

• An array of errors

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http://www.economist.com/node/21528593

- Duke University, 2006 -Prediction of the course of a patient's lung cancer using expression arrays and recommendations on different chemotherapies from cell cultures
- 3 different groups could not reproduce the results and uncovered mistakes in the original work







If the Analyses were done using Workflows.....

- Reviewers could re-run experiments and see results for themselves
- Methods could be properly examined and criticised
- Mistakes could be pinpointed







Workflows are ...

- ... records and protocols (i.e. your *in silico* experimental method)
- ... know-how and intellectual property
- ... hard work to develop and get right
-re-usable methods (i.e. you can build on the work of others)

So why not share and re-use them









WORKFLOW SYSTEMS













Different Types of Workflows

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- Sequences of concatenated steps
- Two types of workflows:
 - Data workflows

A task is invoked once its **expected data** has been received. When complete, it passes any resulting data downstream

Ontrol workflows

A task is invoked once its dependant tasks have been completed







Possible Workflow Structures

<u>Sequence</u> Store intermediate results

Parallel

Apply multiple components to a set of data **Choice** Decisions at runtime **Iteration** Loop through datasets





Freely available open source Current Version 2.4

80,000+ downloads across version

Part of the myGrid Toolkit

Windows/Mac OS X/ Linux/unix



Taverna Workflow Management System February 15, 2011 Op al plugin for Powerful, scalable, open source & domain independent tools for Taverna 2.2 January 27, 2011 BitesizeBio Webinar designing and executing workflows. Access to 3500+ resources. on Taverna, myExperiment and **BioCatalogue** January 11, 2011 PDF and HTML Download for Windows, Learn about the features & Learn about the internals & Get Use Extend Mac OS X or Linux functionality how to develop plugins Taverna is being used for next generation sequence analysis on the Amazon cloud IN PRESS Taverna 2.3 • Taverna 3 Next Generation • SCUFL2 workflow bundle language • Taverna infrastructure VMs

Taverna

Taverna is an open source and domain independent Workflow Management System – a suite of tools used to design and execute scientific workflows and aid *in silico* experimentation.

Taverna has been created by the $^{\rm mv}\!{\rm Grid}$ team and funded through the OMII-UK. The project has guaranteed funding till 2014.

The Taverna suite is written in Java and includes the **Taverna Engine** (used for enacting workflows) that powers both the **Taverna Workbench** (the desktop client application) and the **Taverna Server** (which allows remote execution of workflows). Taverna is also available as a **Command Line Tool** for a quick execution of workflows from a terminal.



Nucleic Acids Res. 2006 Jul 1;34(Web Server issue):W729-32. **Taverna: a tool for building and running workflows of services.** Hull D, Wolstencroft K, Stevens R, Goble C, Pocock MR, Li P, Oinn T.





Taverna Workflows

- Part of UK E-Science myGrid project
- Started in 2001, collaboration across UK
- Now: Manchester (Goble), Oxford/Southampton (DeRoure)
- http://www.taverna.org.uk
- Local Taverna desktop
- Taverna Server
 - Taverna on the cloud



Open source, open development

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- Taverna suite of tools are all open source, free to use and customise
- Large user **community**, active mailing lists
- Lead developers: **myGrid** in Manchester UK
- **Contributors** from across the world
- Plugins developed and shared by contributors
 - XPath, REST, R, BioCatalogue, PBS, SADI, External Tools (UseCase), UNICORE, CDK, Opal, caGrid, XWS, gLite







Taverna Workbench



















Discover, understand and assess services













Discover, understand and assess services

Discover, reuse and share workflows

my experiment













Discover, understand and assess services

Discover, reuse and share workflows

my experiment









SERVICES IN WORKFLOWS







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NOT the same as services on the web (i.e. web forms) Web services support machine-to-machine

interaction over a network

Therefore, you can automatically connect to and use remote services from your computer in an automated way







Web Services – Brief Glossary

- WSDL (Web Service Definition Language)
 - A machine-readable description of the operations supported
- SOAP (Simple Object Access Protocol)
 - An xml protocol for passing messages
- REST (Representational State Transfer)
 - An alternative interface to SOAP







Using Remote Tools and Services with Taverna

- Web Services
 - WSDL
 - REST
- Grid Services
- Local services
- Beanshell (small, local scripts)
- Secure Services
- Workflows
- BioMart
- R-processor



And more.....



io::::mart









Specialist services

BioMart Queries

- Federated database system that provides unified access to distributed data sources
- Ensembl, Pride.....

R-scripts

 R is a free software environment for statistical computing and graphics







Different Approaches to Service Connections

- Open connect to ANY service regardless of type and structure
 - More services, but more heterogeneity
 - Easy to add new services
 - Taverna, Kepler
- Closed connect to services designed specifically to work together,
 - Less heterogeneity, but fewer services
 - Harder to add new services
 - Galaxy server, Knime







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Who Provides the Services?

Open domain services and resources

- Taverna accesses thousands of services
- Third party we don't own them we didn't build them
- All the major providers
 - NCBI, DDBJ, EBI ...
- Enforce NO common data model.



National Center for Biotechnology Information (USA)






Managing Heterogeneities



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- Understand how services work inputs, outputs, dependencies → service descriptions and documentation
- 2. Find and use SHIM (or helper) services to combat incompatibilities
- A Shim Service is a service that:
 - doesn't perform an experimental function, but acts as a connector, or glue, when 2 experimental services have incompatible outputs and inputs











Understanding how services work







Managing Changes to Services

- The Universi of Manchest
- Monitoring detects changes, but the community site can notify users about changes → advanced warning
- EBI Soaplab EMBOSS tools discontinued Feb 13
 - Redirect to alternative services (also from EBI)
- KEGG SOAP services discontinued December 12
 - Replacing with equivalent REST services
- Help identify equivalent or similar services





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GETTING STARTED WITH TAVERNA: DEMO







Enrichment Analysis

Many experiments result in a list of genes (e.g. microarray analysis, Chip-Seq, SNP identification etc)

- Today, we will use Taverna to perform enrichment analyses on a list of genes
- We will enrich our dataset by discovering:
- Which pathways our genes are involved in and visualising those pathways
- 2. The functions of the genes using Gene Ontology annotations







TAVERNA IN USE







Systems biology model building

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- Sequence analysis Protein structure prediction
- Gene/protein annotation Microarray data analysis
- Phylogeny Model simulations sweeps Astronomy
- High throughput screening Proteomics Music
- Phenotypical studies Text mining
- Public Health care epidemiology
- Medical image analysis QTL studies
- QSAR studies Genome Wide Association Studies









Meteorology

Social Science



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Taverna for Omics

Functional Genomics

http://www.myexperiment.org/workflows/126

Publication: Solutions for data integration in functional genomics: a critical assessment and case study. Smedley, Swertz and Wolstencroft, et al Briefings in Bioinformatics. 2008 Nov;9(6):532-44.

Genotype to Phenotype

http://www.myexperiment.org/workflows/16 **Publication:** A systematic strategy for large-scale analysis of genotype phenotype correlations: identification of candidate genes involved in African trypanosomiasis. Fisher et al Nucleic Acids Res. 2007:35(16):5625-33

Next Generation Sequencing

- Whole Genome SNP analysis of different cattle species in response to trypanosomiasis infection (sleeping sickness)
- Large data processing strategies
- Taverna in the cloud deploying and running large data processes using cloud computing services



The Wellcome Trust Funded Host-Pathogen Project



Trypanosomiasis in Africa

Slides from Paul Fisher

http://www.genomics.liv.ac.uk/tryps/trypsindex.html

Cattle Disease Research

\$4 billion US

Different breeds of African Cattle

- Some resistant
- Some susceptible

African Livestock adaptations:

- More productive
- Increases disease resistance
- Selection of traits

Potential outcomes:

- Food security
- Understanding resistance
- Understanding environmental
- Understanding diversity



http://www.bbc.co.uk/news/10403254







Understanding the process: Genotype - Phonotype







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QTL + Microarrays





Phenotype





Quantitative Trait Loci (QTL)



- Regions of chromosomes have distinctive base pair sequences, called markers
- Markers can be assembled into correct order to find regions of chromosomes
- QTL studies can be used to identify markers that correlate with a disease
- QTLs can span
 - small regions containing few genes
 - encompass almost entire chromosomes containing 100's of genes



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QTL

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ragi et al Mammalian Genome 2000 11:645-648 Lemp et al. Nature Genetics 1997 16:194-196





The experiment

A total of 225 microarrays





Huge amounts of data









Data analysis

- Identify pathways that have differentially expressed genes (from microarray studies)
- Identify pathways from Quantitative Trait genes (QTg)
- Track genes through pathways that are suspected of being involved in resistance/susceptibility







Trypanosomiasis Resistance Results

- DAXX gene identified in the workflows
- **Daxx** gene not found using manual investigation methods
- Sequencing of the Daxx gene in Wet Lab (at Liverpool) showed mutations that are thought to change the structure of the protein
- These mutations were also published in scientific literature, noting its effect on the **binding of Daxx protein to p53** protein



p53 plays direct role in cell death and apoptosis, one of the Trypanosomiasis phenotypes



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Reuse, Recycle, Repurpose Workflows



Dr Paul Fisher



Identify QTg and pathways implicated in resistance to Trypanosomiasis in the mouse model

Identify the QTg and pathways of colitis and helminth infections in the mouse model





Dr Jo Pennock



Same Host, another Parasite...but the SAME Method

- Mouse whipworm infection parasite model of the human parasite - *Trichuris trichuria*
- **Understanding Phenotype**
- Comparing resistant vs susceptible strains Microarrays
 Understanding Genotype
- Mapping quantitative traits Classical genetics QTL

Joanne Pennock, Richard Grencis University of Manchester





Workflow Results

- Identified the biological pathways involved in sex dependence in the mouse model, previously believed to be involved in the ability of mice to expel the parasite.
- Manual experimentation: Two year study of candidate genes, processes unidentified
- Workflow experimentation: Two weeks study identified candidate genes

Joanne Pennock, Richard Grencis University of Manchester





"Traditional" Hypothesis-Driven Analyses

<u>'Cherry Pick</u>'

genes

200 genes

Pick the genes involved in immunological process

40 genes



Pick the genes that I am most familiar with



Biased view

What about the other 198 genes? What do they do?









- Workflow analysed each piece of data systematically
 - Eliminated user bias and premature filtering of datasets
- The size of the QTL and amount of the microarray data made a manual approach impractical
- Workflows capture exactly where data came from and how it was analysed
- Workflow output produced a manageable amount of data for the biologists to interpret and verify
 - "make sense of this data" -> "does this make sense?"





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Sharing and Reusing Workflows







Workflow Repository



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Just Enough Sharing....

- myExperiment can provide a central location for workflows from one community/group
 - You specify:
 - Who can look at your workflow
 - Who can download and run your workflow
 - Who can modify your workflow
 - Ownership and attribution

Sł	Share with my Groups:										
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Statistics

shim | similarity | simplifier

Download Scalable Diagram (SVG)

Reuse, Reuse, Reuse



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FINDING AND USING A MYEXPERIMENT WORKFLOW: DEMO







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- Implicit iterations
 - With customisable list handling
- Parallelisation
 - Run as soon as data is available
- Streaming
 - Process partial iteration results early
- Retries, failover, looping
 - For stability and conditional testing







Data and Provenance

- Workflows can generate vast amount of data how can we manage and track it?
- We need to manage data AND metadata AND experimental provenance
- Scientists need to check back over past results, compare workflow runs and share workflow runs with colleagues
- Scientists need to look at intermediate results when designing and debugging






Data and Provenance Handling

- Provenance captured for workflow runs
 - Trace execution steps, view intermediate values while running
 - Export as Open Provenance Model (OPM) / RDF
 - Proof and origin of produced outputs
 - Extensible annotations
- Wf4Ever: reproducible **research objects**
 - Workflow/data as a scientific publication → preservation
 - Need to capture more service data and metadata





Advanced users design and build workflows (informaticians)



Others "replay" workflows through a web interface or Taverna Lite

Spectrum of Users



Intermediate users reuse and modify existing workflows





TAVERNA SERVER







Taverna Server

- Running workflows remotely
 - Through other client software
 - Via a web interface
- Tapping into remote computing resources
 - Execution on servers, grids or clouds







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Limitations of the Desktop workbench

- You have to install it and learn how to use it
- Although computation could happen at remote service locations, data and computation can also happen locally
- High throughput experiments take a lot of compute and a lot of time
- Long running workflows need uninterrupted execution







Data Limitations with the Desktop Workbench

- Running the Workbench is limited by:
 - Local disk space for storing data
 - Network speeds for up/download
 - Firewall access







Taverna Server



Taverna Server in Use

- T2Web, running myExperiment workflows through web interface
- HELIO Heliophysics Integrated Observatory
- SCAPE SCalable Preservation Environment (digital archives)
- BioVel Biodiversity Virtual e-laboratory
- Cloud analytics for the life sciences Taverna on the cloud



Running Taverna through Galaxy







Running Taverna Through Galaxy

Workflow interoperability

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- The methods are more important than the platform
- Workflows in Galaxy and Taverna already exist
- Any Taverna workflow can be made available to Galaxy users
- Discover and import from myExperiment

() Downloa	my experiment
	Download Workflow File/Package (T2FLOW)
	وکې Download Workflow as a Galaxy tool
🕕 Run	
	Run this Workflow in the Taverna Workbench
S	Option 1:
	Copy and paste this link into File > 'Open workflow location' http://www.myexperiment.org/workflows/1662/download?version=1 [More Info 河]





Running Taverna through Galaxy

Kostas Karasavvas, NBIC

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Connect the Taverna and Galaxy communities

- •Galaxy specialises in genomics, next gen sequencing etc
- •Taverna can access more 'downstream' analysis services e.g. pathway analyses, literature, GO enrichment etc





Cloud Analytics for the Life Sciences

- Workflows for genetic diagnostics (for the NHS)
 - Exome and whole genome
 - SNP analysis and annotation
- Execution on the cloud
 - Secure execution and results handling
 - Elastic to cope with demand
 - Pay-as-you-go cheap at the point of use



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A Typical Workflow



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• Parse files from SNP calling machines

- Annotate SNPs
- Predict effects (BioMart, VEP, polyphen)

ParseLineOfDiBayesOutput









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A Typical Workflow

ElasticView	(v 0.1 Alpha) Powered by Eagle Genomics Ltd.	madhu Logout »
My Workspace	My Activity	
💓 Data 🛛 🛨 🕐 🕐	Getting Started madhuruns 🗷	
Workflows -	Inputs	(+)(\$)(?)
⊳ 🎲 Hello, World ! 🌒	Progress	
Simple pass thr		<u>^</u>
Simple SNP work		
🔯 madhuruns 🛛 🔞		
		Overall Run Progress
	InputAndParseDiBayesFile	
	ParseLineOfDiBayesOutput	
	BioMartQuery 1/1 done	DONE DONE
		~
	Results	(+)(\$)



Advantages

- Workflows are reusable
- Cloud computing infrastructure manages large data and processes – no need for big local resources
- Genomic analyses easy to run in parallel
- Simple submission through web interface for researchers
- Selecting ready-made workflows
- Simple and limited configuration of workflows
- Collaboration with industry commercialisation of the services







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Biodiversity Virtual e-Laboratory

- A network of expert scientists who develop, support, and use workflows and services in biodiversity
- Workflows, including:
 - Phylogenetics
 - Metagenomics
 - Ecological niche modelling
 - Species distribution modelling
 - Models how environmental niches of a species shift due to the changing climate.





BioVel:



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Case Study: Ecological Niche Modelling





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Interaction Service: Communicating with your Remote Workflow

- Service suspends workflow execution to wait for further input from the user
- Interaction through the web interface
- Messages between workflow engine and web page via ATOM feeds, using Javascript









TAVERNA SERVER DEMO

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A RECAP ON TAVERNA WORKFLOWS







Summary

Taverna Advantages

- Allows complex analysis pipelines
- Access to local and remote services (>8000 in biology)
- New services 'added' instantly
- Workflows can be shared and run in any Taverna instance
- Can be used for any areas of bio or non-bio research





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Issues and Problems

- Transferring large data over networks
 - Take services to data (like in the cloud example)
 - Pass by reference, rather than by value
 - Transfer only what you need for analysis
- Service incompatibility
 - shims sharing and reusing
 - Creating integrated sets of services \rightarrow components
- Services changing and vanishing
 - Use BioCatalogue and myExperiment to identify alternatives and find similar methods







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- A set of services designed to be compatible by
 - Consistent annotation to help understand how they work
 - Combining with shims to provide uniform (or predictable) input and output formats
- Hiding the complexity of public web services







Taverna Workflows Supporting in silico Science





Taverna 3 roadmap

- OSGi plugin system
- Workflow language: Scufl2
 - Making programmatic interaction easier
 - Compound format; embedding metadata, dependencies, independent API for creating/inspecting workflows
- Components
 - Finding/sharing command line tool descriptions
 - Richer way of finding compatible services







Summary – Workflow Advantages

- The Universit of Manchest
- Informatics often relies on data integration and large-scale data analysis
- Workflows are a mechanism for linking together resources and analyses
- Automation
- Large data manipulation
- Promote reproducible research
- myExperiment allows you to reuse workflows and benefit from others work
- Easy to find and use successful analysis methods





More Information



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http://www.taverna.org.uk



- myExperiment
 - http://www.myexperiment.org



- BioCatalogue
 - http://www.biocatalogue.org









1The University oof Manchestel

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 - Paul Fisher



Harry Noyes



