

# Computational method preservation: workflows and models matter

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# Computer Engineering and Service Perspective

Astronomy

Digital Preservation

Helio Physics

Social Science

Public Health Epidemiology



Systems Biology

Synthetic Biology

Pharmacology

Genomics

Biodiversity

















#### Software and data

BRITISH AUTUBIN

- Cultural and technical trends in software development are in our favour
  - Better dependency management for software
  - Better testing and integration
  - Better version control
  - More collaborative open development
  - Developers hate the "it worked on my machine" bugs
- · Computational cloud culture
  - Cheaper for research groups
  - Better for collaborative projects
  - Better for scaling to large data sets
  - Requires running code in different environments
    - · Local, single machine multi-machine

- · Virtual machines and related technology work
  - Fit researcher workflow
  - Make it easier to develop and debug
  - Must manage dependencies for commercial environments
- · Virtual machines let you bring computation to data
  - Data is too big to download
  - Data protection, licensing issues get in the way, too
- · How can virtual machines last?
  - Is there a Universal Virtual Machine?
  - Is there a virtual machine designed for the longer term?
  - Can virtual machines be part of the scholarly record?

WANTE WANTE

[Adam Farquhar, 14 March 2016]

Morin et al Shining Light into Black Boxes Science 13 April 2012: 336(6078) 159-160 Ince et al The case for open computer programs
Nature 482, 2012

# The Research community produces software

91% scientific software is important for their own research

developing scientific software is important for their own research

claimed to spend more time developing scientific software than they did 10 years ago

spend at least one fifth of their time developing software



Computer systems have been prone to error since the early days.

REPRODUCIBILITY

# Journal buoys code-review push

Nature Biotechnology asks peer reviewers t accessibility of software used in computation

BY ERIKA CHECK HAYDEN

The finding seemed counterintuitive: warming in North America was driving plant species to lower elevations — not towards higher, cooler climes, as ecologists had long predicted. But the research published in Global Change Biology indeed turned out to be wrong. In February, the journal retracted the paper after its intriguing conclusion was found to be the result of errant software code.

Worried about a rising tide of results that fail to measure up, journals are starting to take action. In the latest such move, Nature Biotechnology anno to prevent such emb pages (Nature Biote peer reviewers will n availability of docun used in computation description of the w exploring whether pe plex code using serviof software that allow a shareable represent environment.

Researchers say the needed. They note t

"An article about computational science in a scientific publication is not the scholarship itself, it is merely advertising of the scholarship. The actual scholarship is the complete software development. environment, [the complete data] and the complete set of instructions which generated the figures."

> David Donoho, "Wavelab and Reproducible Research," 1995

#### WORLD VIEW A personal take on events



# Funders must encourage scientists to share

To realize the full potential of large data sets, researchers must agree on better ways to pass data around, says Martin Bobrow.

ow can we make best use of the vast amounts of data on genomics, epidemiology and population-level health being collected by researchers? Maximizing the benefits depends

and the undertakings they ask of potential data users, are usually similar across studies. Where possible, funders should encourage the stream-

#### Preservation of Method

method isn't described here b/c this High Impact Report is 200 words. see Supplement Appendix L for vague description #overlyhonestmethods

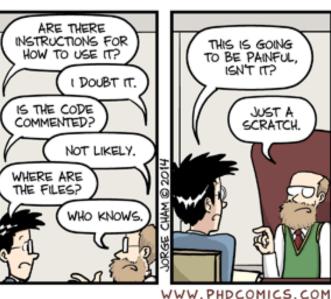
You can download our code from the URL supplied. Good luck downloading the only postdoc who can get it to run, though #overlyhonestmethods

4:52 PM - 8 Jan 2013





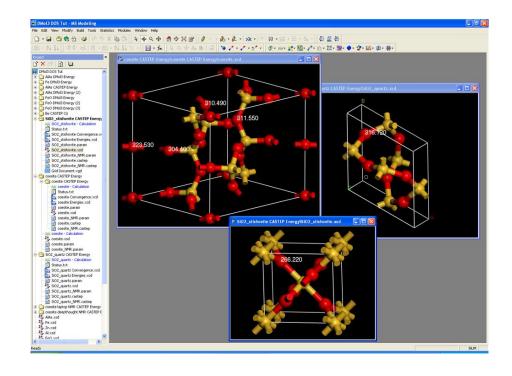




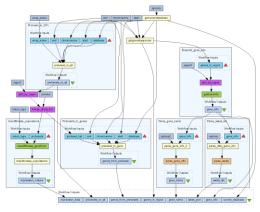


## Transitory

Long Lived Computational Chemistry – CASTEP Since 1990s



# Sharing, publishing and preserving pieces of process



http://www.mygrid.org.uk/tools/taverna/

## computational workflows

# software

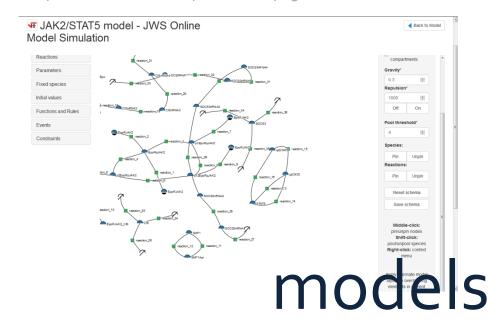
Monitor the formation of an aromatic imine by HMR and CMR in CDC13

- 1. Make up separate 1 mL of 1M solutions of piperonal and 5-methylfurfurylamine in CDC13.
- 2. Take HMRs and CMRs of the aldehyde and amine. Use 5 sec relaxation time and acquire for about 15 mins for the CMR. This should be good enough based on James' results at 1M in methanol.
- Combine the two solutions into a 1 dram vial and shake vigorously then transfer to an NMR tube.
- 4. Take HMR at 5, 10 and 20 minutes after mixing.
- 5. Take CMR at 25 min after mixing.
- 6. Take HMR at 40 min after mixing.
- 7. Take CMR at 45 min after mixing.
- 8. Take HMR at 80 mins after mixing.
- 9. Take CMR at 85 mins after mixing.
- Continue to take NMRs after interval doubling until no more change is observed

SOPS

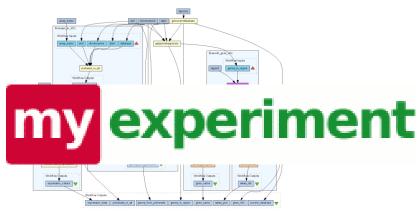
http://openwetware.org

http://usefulchem.wikispaces.com/page/code/EXPLANoo1





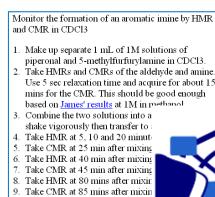
# Sharing, publishing and preserving pieces of process



http://www.mygrid.org.uk/tools/taverna/

# computational workflows

software



 Continue to take NMRs after inte until no more change is observed. SOPS



http://usefulchem.v

:/EXPLANoo1



models



**Olive Executable Archive** 



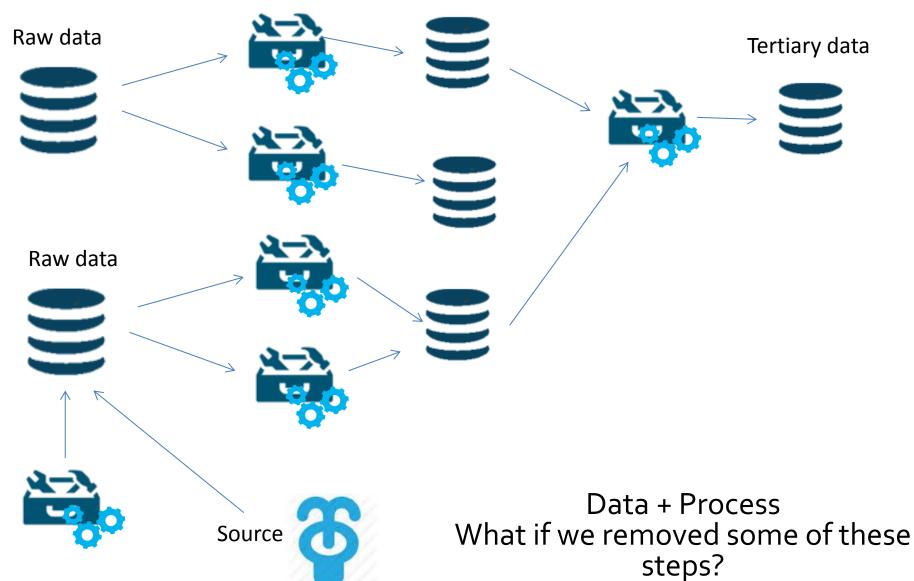


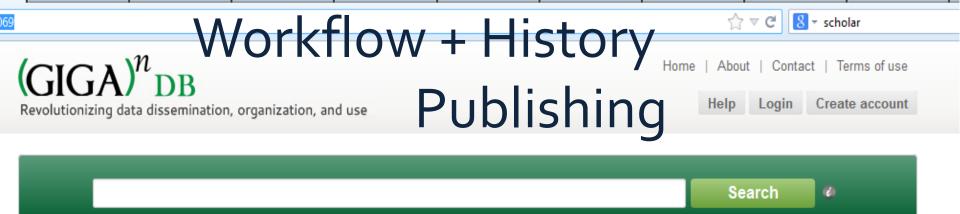


# Data collection Complex Assemblies Data discovery Data assembly, cleaning, and refinement Modeling Statistical analysis Insights Scholarly Comms & Reporting









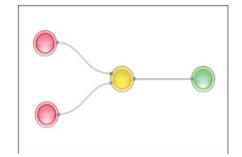
Data released on December 30, 2013

#### GigaGalaxy workflows and histories from "Galaxy tools to study genome diversity"

Bedoya-Reina, OC; Ratan, A; Burhans, R; Kim, HL; Giardine, B; Riemer, C; Li, Q; Olson, TL; Loughran Jr, TP; vonHoldt, BM; Perry, GH; Schuster, SC; Miller, W (2013): GigaGalaxy workflows and histories from "Galaxy tools to study genome diversity" GigaScience Database. <a href="http://dx.doi.org/10.5524/100069">http://dx.doi.org/10.5524/100069</a>

Intra-species genetic variation can be used to investigate population structure, selection, and gene flow in non-model vertebrates; and due to the plummeting costs for genome sequencing, it is now possible for small labs to obtain full-genome variation data from their species of interest. However, those labs may not have easy access to, and familiarity with, computational tools to analyze those data.

#### Workflow, Software



A suite of tools for the Galaxy web server have been created aimed at handling nucleotide and amino-acid polymorphisms discovered by full-genome sequencing of several individuals of the same species, or using a SNP genotyping microarray.

In addition to providing user-friendly tools, a main goal is to make published analyses reproducible. These tools are presented in a GigaScience publication (doi: 10.1186/2047-217X-2-17), and in order to facilitate readers to repeat and recreate the examples given in the paper, we present here the pipelines and histories, both accessible from our GigaGalaxy server, and as Galaxy XML files available to download. The five workflows included relate to examples in the paper dealing with nuclear-genome diversity in non-human vertebrates, and also illustrate the application of the tools to fungal genomes, human biomedical data, and mitochondrial sequences.

#### Related manuscripts:

doi:10.1186/2047-217X-2-17

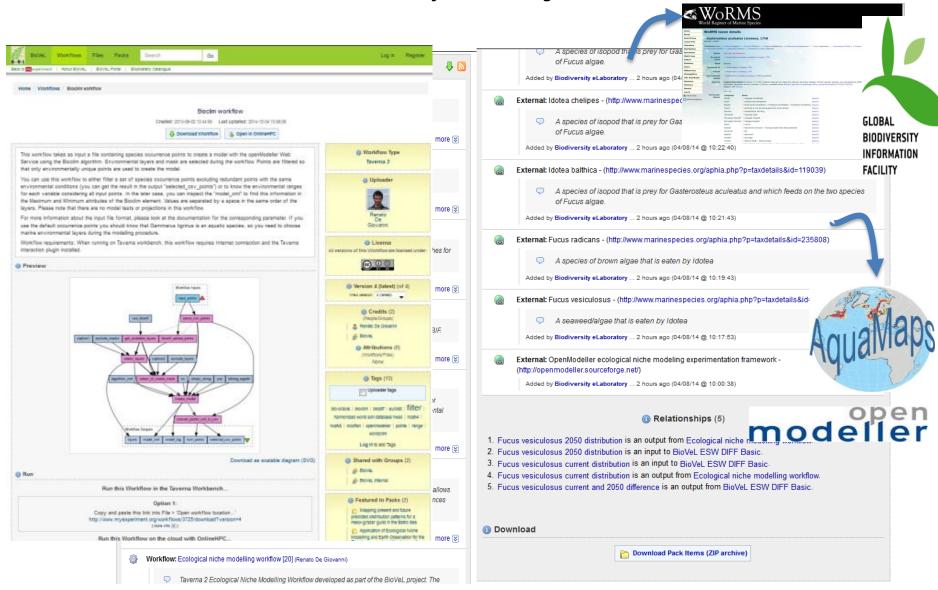
[Scott Edmunds]



#### my experiment Workflow Commons



"Mapping present and future predicted distribution patterns for a meso-grazer guild in the Baltic Sea" Sonja Leidenberger et al

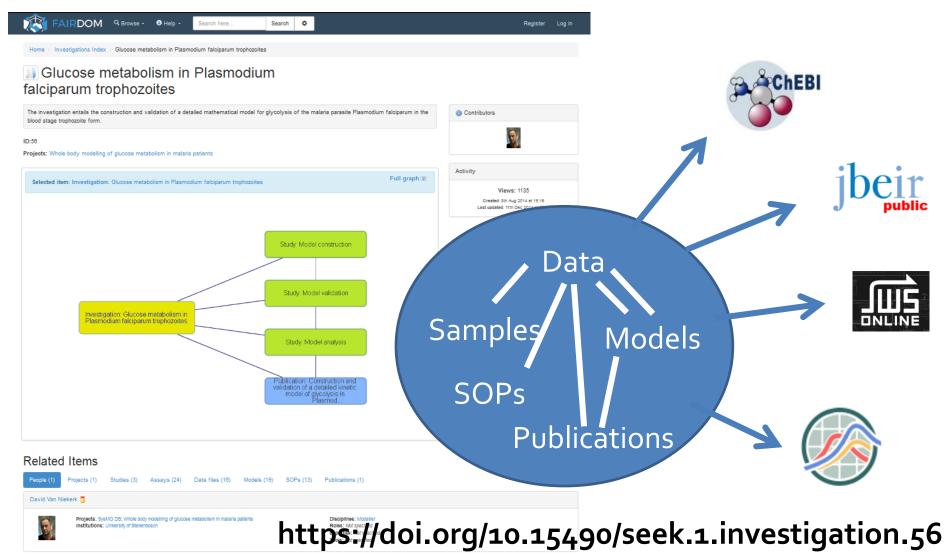




#### fair-dom.org

Sustainable Infrastructure for Systems Biology

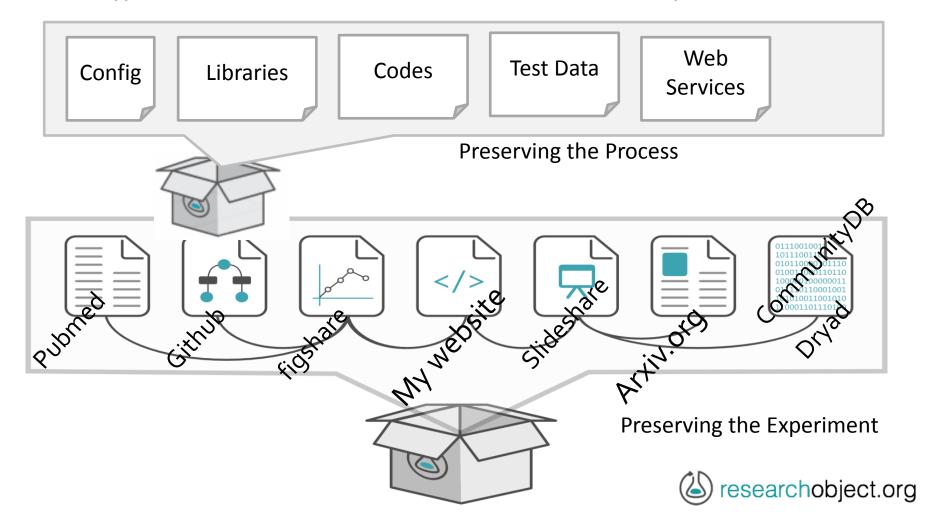
# Sys Bio Commons data+ models + ops



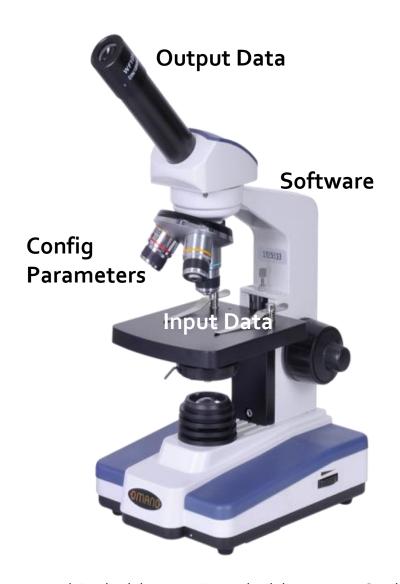
#### Scholarly Record: Crossing Silos, Compound Object

Datasets, Data collections
Standard operating procedures
Software, algorithms
Configurations,
Tools and apps, services

Codes, code libraries Workflows, scripts System software Infrastructure Compilers, hardware



## Computational "Datascope" Instruments



Experiment

#### **Materials**

datasets, parameters, algorithm seeds

#### **Methods**

techniques, algorithms, spec. of the steps

dona

#### Instruments

codes, services, scripts, underlying libraries

#### Laboratory

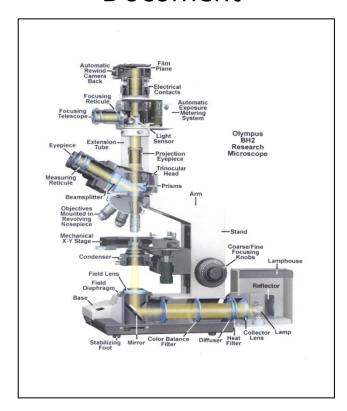
sw and hw infrastructure, systems software, integrative platforms

Drummond, Replicability is not Reproducibility: Nor is it Good Science, online Peng, Reproducible Research in Computational Science *Science 2 Dec 2011: 1226-1227.* 

## Computational Instrument Preservation

preserve or sustain? form or function? prepare to repair!

#### Document



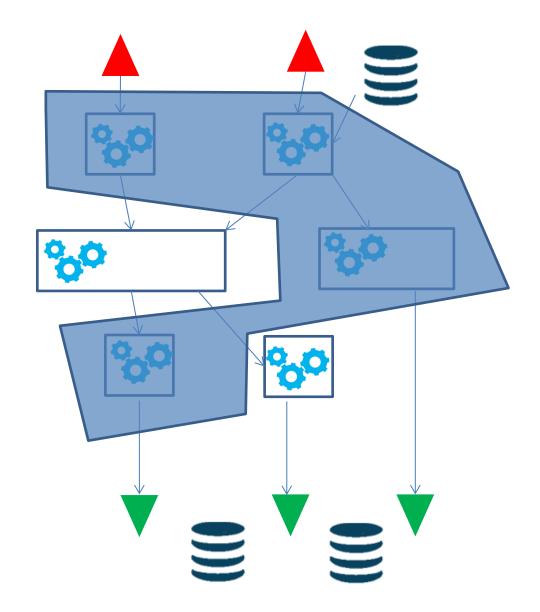
Preserve by Reporting
Archived Record

#### Preserve/Conserve/Reconstruct



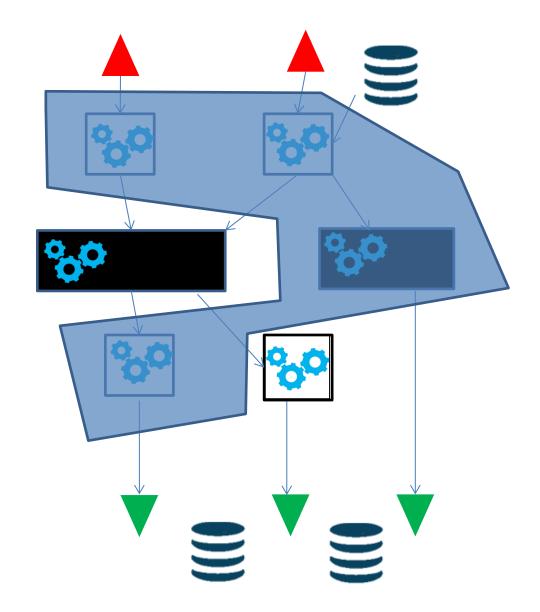
Preserve by Maintaining
Active Instrument

- Encapsulation
- Black Box
- Change



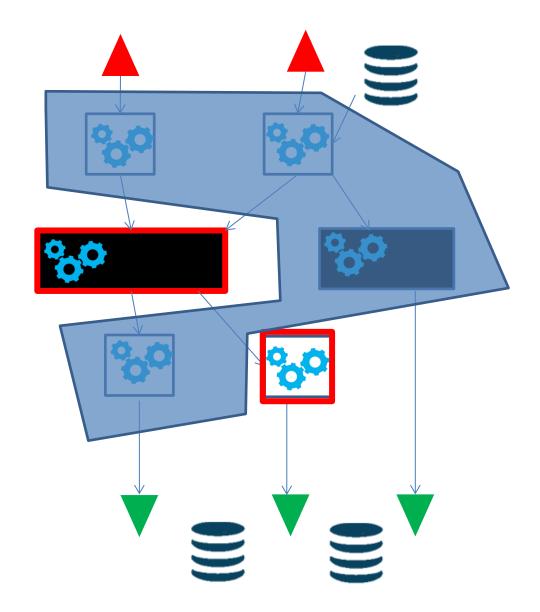


- Encapsulation
- Black Box
- Change





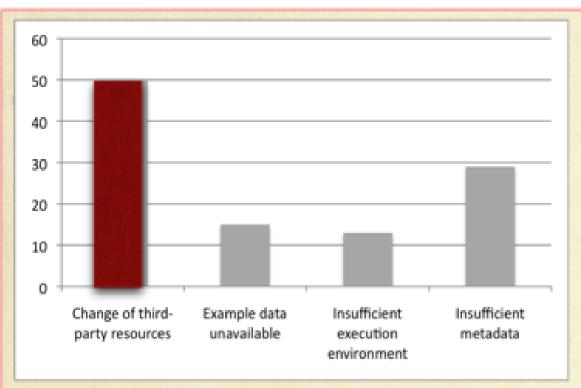
- Encapsulation
- Black Box
- Change





## Instrument Entropy





Mitigate Migrate Adapt Die

Detect, Repair, Preserve Partial replication Approximate reproduction Verification, Benchmarks

Zhao, et al. 2012 Why workflows break -Understanding and combating decay in Taverna workflows, 8th Intl Conf e-Science 2012

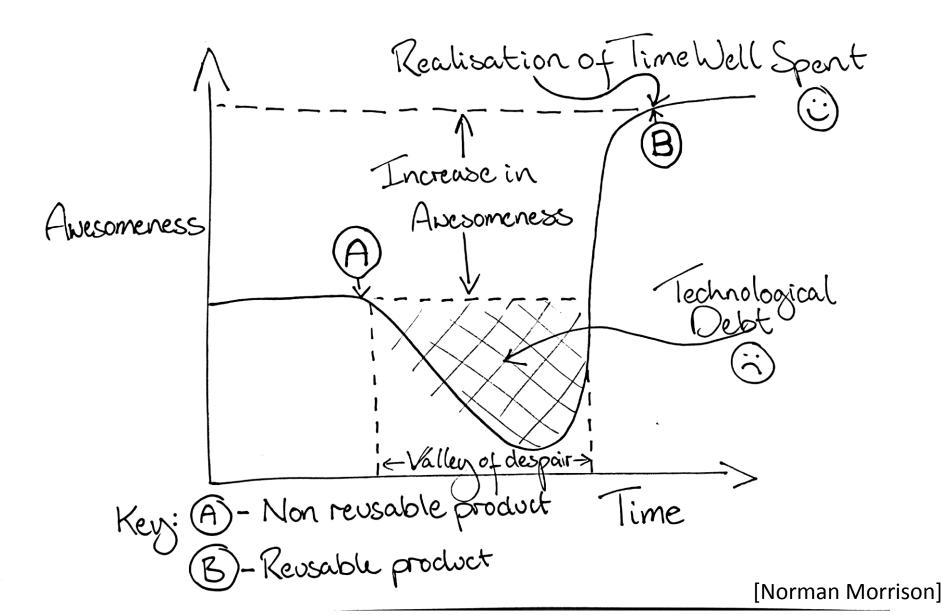


#### Target Pack374 does not satisfy checklist for ready-to-release.

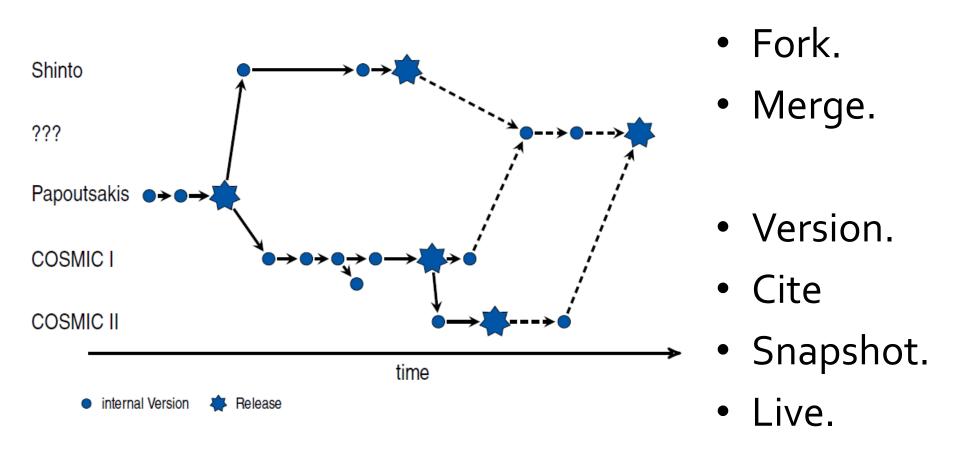
- Experiment hypothesis is not present
- Workflow design sketch is not present
- ✓ All workflow definitions are accessible
- One or more web services used by one of the workflows are inaccessible, including *btit*
- Input data is not present
- Experiment conclusions are not present

Wf4Ever project

## Instrument entropy



#### Instrument Evolution



Haus et al, *BMC Systems Biology*, 2011, 5:10 Solvent production by Clostridium acetobutylicum [Martin Scharm, Rostock University]

# Dependency

multi-part and multi-sourced availability & volatile activity of resources, services, systems, components

#### Selective retention

sustained compared to preserved what is "forever" clock cycle of software? of method?



#### Portability



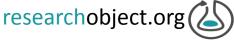
#### **Virtual Machines**





#### **Portable Packaging**







Science as a Service Integrative frameworks





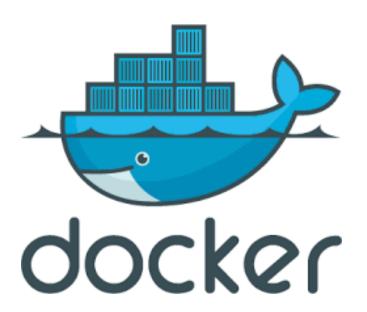




Open Source
Workflows/Scripts
Models









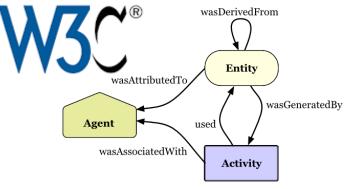
#### **Bio Docker**

**Docker for Bioinformatics** 

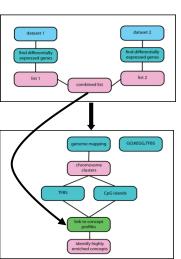
Pre-configured prepackaged Docker containers

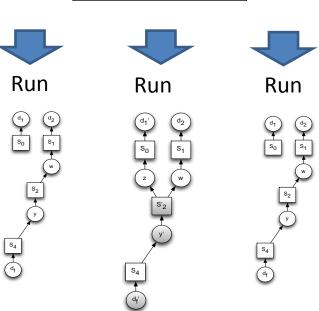


- Describing method apart from execution
- Run provenance,
   Parameter provenance
- Relating data and process



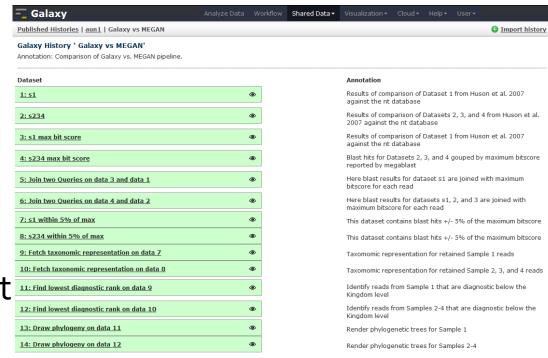
https://www.w3.org/TR/prov-primer/





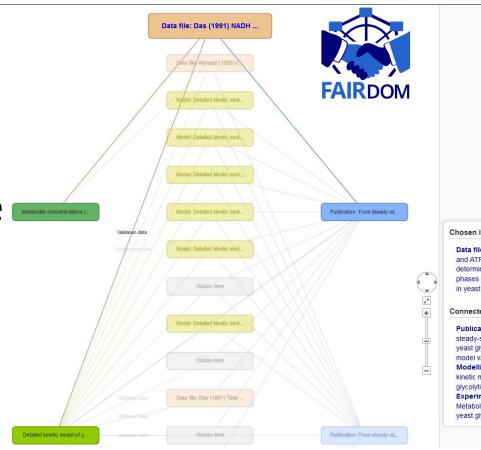
# Preservation Potential of Provenance Untapped Big Data

- Track versions
- Partially reproduce
- Reverse engineer
- Repair
- Alternates
- Black box recovery
- Calc data quality & trust
- Track contrib / credit
- What data to keep
- Track error propagation
- Optimisations





- Describing method apart from execution
- Run provenance,
   Parameter provenance
- Relating data and process
  - Validation
  - Construction
  - Predicted





- Describing method apart from execution
- Run provenance,
   Parameter provenance
- Relating data and process







# Common Workflow Language

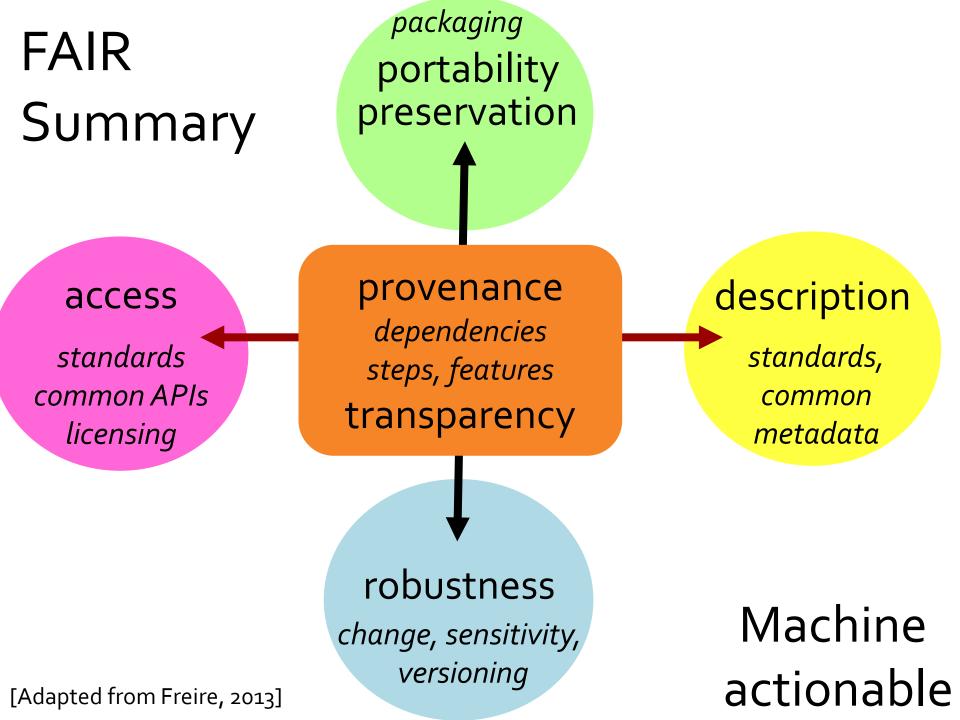
workflow mark up

- Community grassroots effort
- Portability of data analysis workflows
- Describe analysis tools and workflows
- Builds on pre-existing technologies
  - <u>JSON-LD</u> and <u>Avro</u> for data modelling
  - <u>Docker</u> for portable runtime environments.











systematic way of dealing
with workflow
reproducibility, preservation,
portability, repair

Standards.

Graceful degradation.

Technology Independent.

Machine-processable.

Jation.

Incremental.

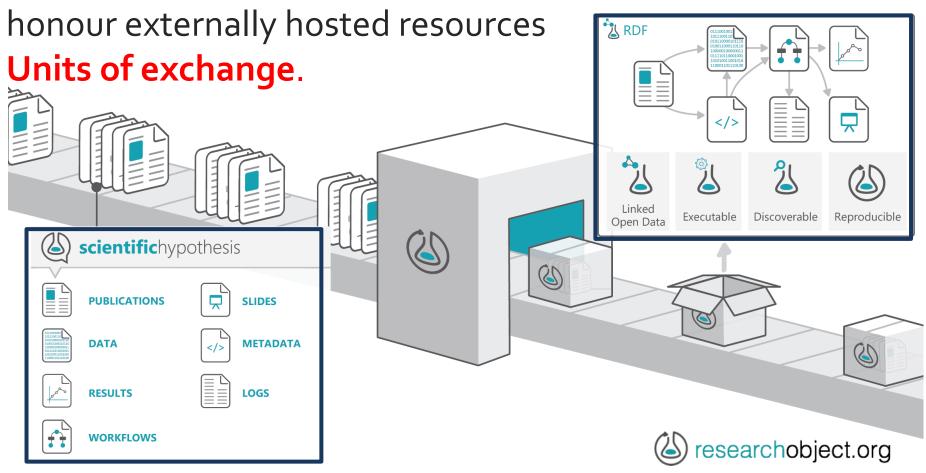
Commodity tooling.
The least possible.
The simplest feasible.

Low tech.

researchobject.org

Framework to bundle, port and link local and referenced resources.

Metadata Objects that carry Research Context and



Multi-various products, platforms, resources.

First class citizens - id, manage, credit, track, profile, focus





Except the bits

MICKE

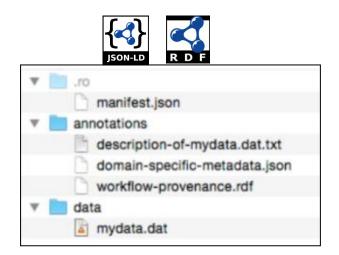
are somewhere else modeller. Google refine CATALOGUE OF LIFE **BioSTIF** 2012 Annual Checklist

# Metadata objects



#### Manifest

Metadata
Describes the aggregated resources, their annotations and their provenance







#### Container

Packaging content and links to content:

Zip files, Docker images, Baglt, ...

Catalogues & Commons Platforms:

FAIRDOM SEEK, STELAR eLab, ...





### Metadata and Manifests



#### **Manifest Construction**

- Identification id, title, creator, status.... doi, epic, orcid, purl, RII, identifiers.org
- Aggregates —to link things together.... OAI-ORE
- Annotations about things & their relationships.... W3C OADM

http://w3id.org/ro/



#### **Manifest Description**

- Checklists what should be there
- Provenance where it came from
- Versioning its evolution
- Dependencies what else is needed

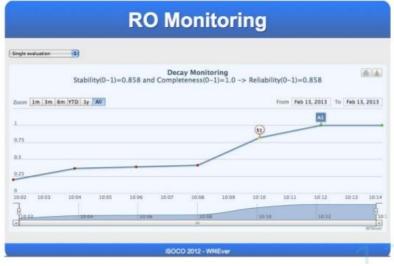


# Manifest Content Profiles Workflow RO, Sys Bio RO ...

Checklist Type specific Experiments Library Versioning Provenance **Publishers** Citation NISO-JATS **Dublin Core EFO** ISA MIAPE **JERM SBOI SBML** SED-ML **Dependencies** 

Gamble et al (2012)
MIM: A Minimum Information Model
vocabulary and framework for Scientific
Linked Data 10.1109/eScience.2012.6404489

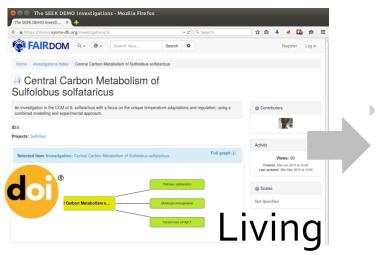








#### https://doi.org/10.15490/seek.1.investigation.56



Preserved
Model
SOPs
Data files
Links with data files
Experimental context

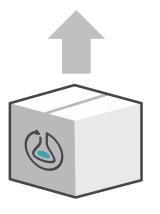




Modified

08 June 2015, 11:26

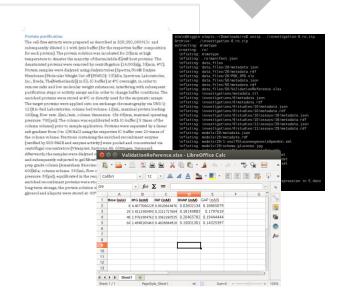
08 June 2015, 11:26





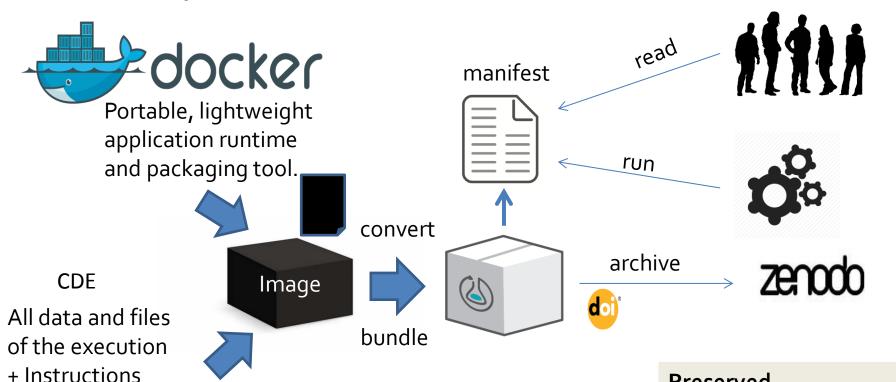
investigation-6.ro.zip

### Snapshot



## ATLAS Collider Data Analytics

### Vardeman, Da Huo University of Notre Dame



Won Galaction Tal Colorenter Topole Argon Colorenter

ATLAS and CMS detector data

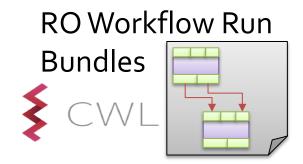
Relate files and layers Add provenance and annotations Link in other content Preserved
Same data
Same code
Same run time
environment







Metagenomics
pipelines and BDS
LARGE datasets



Standardised packing of Systems Biology models





European Space Agency RO Library Research Object Bundles for Data Releases As if they were software Dataset "build" tool





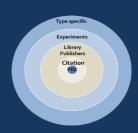
Multi-Owned
Policies Tools
Repositories

Lifecycle Steward Ship

Training

Credit

Annotation profiles progressive extensions



Manifest
Core model
using standards



Implementation
Profiles
using legacy &
commodity
platforms



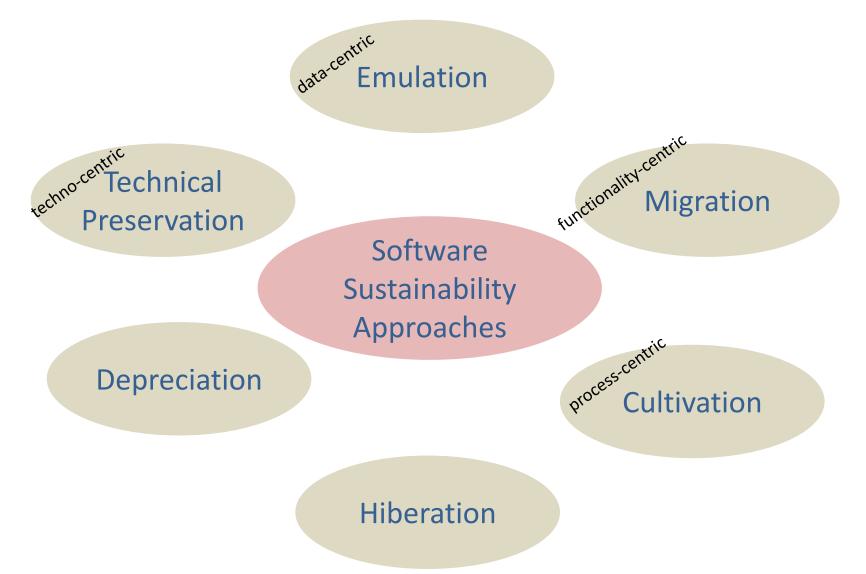
**Metadata formats** 





**API specification** 





http://www.software.ac.uk/resources/approaches-software-sustainability

## Software Artisans

56%

Of UK researchers develop their own research software or scripts

73%

Of UK researchers have had no formal software engineering training



## Software Sustainability Institute





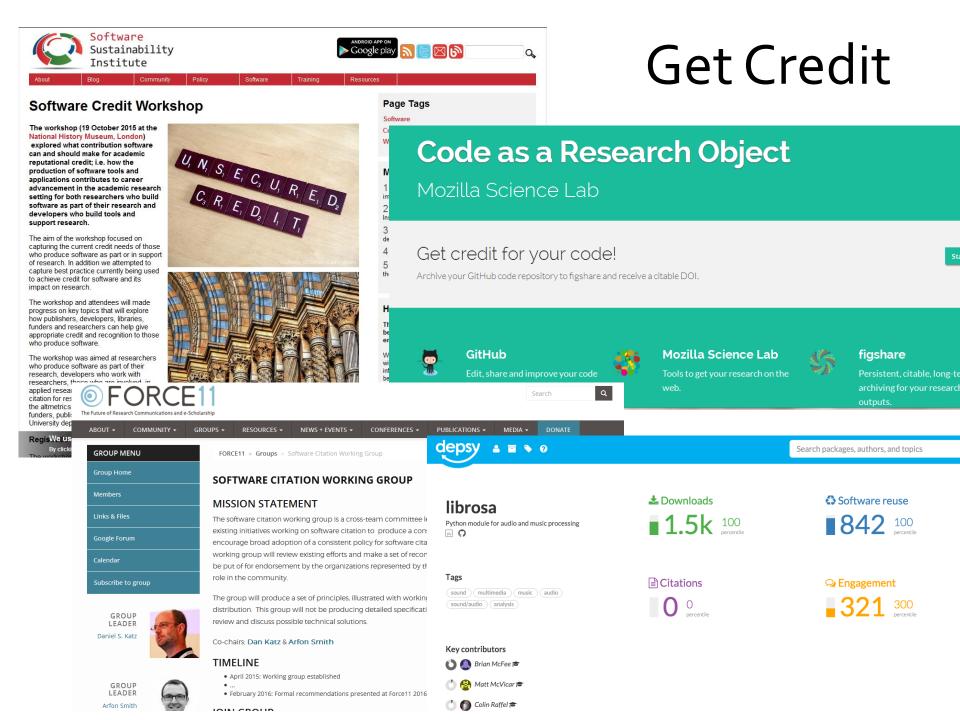


## DATA CARPENTRY

MAKING DATA SCIENCE MORE EFFICIENT







## People depend on my software?!

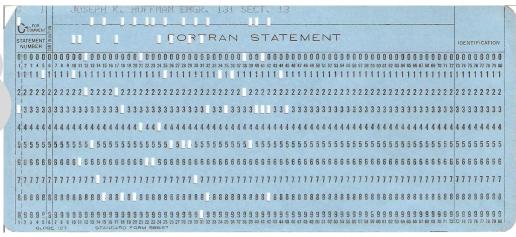
But I'm a researcher not a service provider...



The invisibility of infrastructure.

## Software is free, like free puppies.





### Links

- <a href="http://www.researchobject.org">http://www.researchobject.org</a>
- http://www.wf4ever-project.org
- http://www.fair-dom.org
- <a href="http://seek4science.org">http://seek4science.org</a>
- <a href="http://rightfield.org.uk">http://rightfield.org.uk</a>
- http://www.software.ac.uk