

Data and Software Preservation for Open Science

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About me

- Born and raised in Poland
- Spent 13 years at Poznan Supercomputing and Networking Center
 - Involved in many EU-funded projects
- 7 years ago moved to the US
 - Center for Computation and Technology, LSU (2008 mid 2009)
 - Center for Research Computing (CRC), Notre Dame (since mid 2009)



CRC



- Multidisciplinary enterprise
 - 10 faculty, 10 HPC engineers and user support, 20 research programmers, admin staff, plus grad students and undergrad interns
 - HPC/HTC services and research
 - Cyberinfrastructure (eScience) development, Data management
 - Science and CI teams working on projects in science, engineering and humanities



What is this talk really about?

Q: Preservation for what?

A: For reproducibility/reuse/replicability/r... in computational science



Science and digital age

Science is the mother of the digital age

However, since the moment CERN has created the open internet, science has struggled to go digital and to go open.

What is open science and why is it important?



What is open science?

The term refers to efforts by researchers, governments, research funding agencies and the scientific community itself to make the primary outputs of publicly funded research results – publications and the research data (and software if possible) – publicly accessible in digital format with no or minimal restriction as a means for accelerating research.

These efforts are in the interest of enhancing transparency and collaboration, and fostering innovation.



Scientific Ideals

Innovative ideas

Reproducibility (the cornerstone of the scientific method)

Accumulation of knowledge

CORRESPONDENCE

Believe it or not: how much can we rely on published data on potential drug targets?

Power failure: why small sample size undermines the reliability of neuroscience

Katherine S. Button^{1,2}, John P. A. Ioannidis³, Claire Mokrysz¹, Brian A. Nosek⁴, Jonathan Flint⁵, Emma S. J. Robinson⁶ and Marcus R. Munafò¹

Abstract | A study with low statistical power has a reduced chance of detecting a true effect, but it is less well appreciated that low power also reduces the likelihood that a statistically significant result reflects a true effect. Here, we show that the average statistical power of studies in the neurosciences is very low. The consequences of this include overestimates of effect size and low reproducibility of results. There are also ethical dimensions to this problem, as unreliable research is inefficient and wasteful. Improving reproducibility in neuroscience is a key priority and requires attention to well-established but often ignored

Why Most Published Research Findings Are False

John P. A. Ioannidis

Summary

There is increasing concern that most current published research findings are false. The probability that a research claim is true may depend on study power and bias, the number of other studies on the same question, and, importantly, the ratio of true to no relationships among the relationships probed in each scientific field. In this framework, a research finding is less likely to be true when the studies conducted in a field are smaller; when effect sizes are smaller; when there is a factors that influence this problem and some corollaries thereof.

Modeling the Framework for False Positive Findings

Several methodologists have pointed out [9–11] that the high rate of nonreplication (lack of confirmation) of research discoveries is a consequence of the convenient, yet ill-founded strategy of claiming conclusive research findings solely on the basis of a single study assessed by formal statistical significance, typically formal statistical significance, typically stappropriately represented marized by p-values, but, ately, there is a widespread that medical research articles

an be proven that t claimed research ndings are false.

e interpreted based only on Research findings are defined ny relationship reaching atistical significance, e.g., interventions, informative s, risk factors, or associations. " research is also very useful. e" is actually a misnomer, and iterpretation is widespread. , here we will target hips that investigators claim her than null findings. been shown previously, the ty that a research finding true depends on the prior ty of it being true (before e study), the statistical power idy, and the level of statistical ice [10,11]. Consider a 2 × 2 which research findings are d against the gold standard elationships in a scientific a research field both true and otheses can be made about ence of relationships. Let Rtio of the number of "true hips" to "no relationships" nose tested in the field. R

is characteristic of the field and can vary a lot depending on whether the field targets highly likely relationships or searches for only one or a few true relationships among thousands and millions of hypotheses that may be postulated. Let us also consider, for computational simplicity, circumscribed fields where either there is only one true relationship (among many that can be hypothesized) or the power is similar to find any of the several existing true relationships. The pre-study probability of a relationship being true is R/(R+1). The probability of a study finding a true relationship reflects the power 1 - β (one minus the Type II error rate). The probability of claiming a relationship when none truly exists reflects the Type I error rate, α. Assuming that c relationships are being probed in the field, the expected values of the 2 x 2 table are given in Table 1. After a research finding has been claimed based on achieving formal statistical significance, the post-study probability that it is true is the positive predictive value, PPV. The PPV is also the complementary probability of what Wacholder et al. have called the false positive report probability [10]. According to the 2 \times 2 table, one gets PPV = $(1 - \beta)R/(R$ - βR + α). A research finding is thus

Citation: loannidis JPA (2005) Why most published research findings are false. PLoS Med 2(8): e124.

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Abbreviation: PPV, positive predictive value

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Competing Interests: The author has declared that no competing interests exist.

DOI: 10.1371/journal.pmed.0020124

Challenges

Lack of documentation of the workflow

Lack of transparency across the workflow

Lack of discoverability, especially unpublished work

Hard to recover the context of experiments



What do we do about it?



ND's efforts to promote Open Science

- DASPOS Data and Software Preservation for Open Science
- National Data Service
- Collaboration on Open Science Framework with the Center for Open Science
- Series of Workshops





Data and Software Preservation WWW. daspos.org for Open Science

ABOUT

PEOPLE

WORKSHOPS

RESEARCH

REPORTS

The massive data sets accumulated by High Energy Physics (HEP) experiments represent the most direct result of the often decades-long process of construction, commissioning and data aguisition that characterize this science. Many of these data are unique and represent an irreplaceable resource for potential future studies. Forward-thinking efforts for preservation are necessary now in order to achieve the relevant parameters, analysis paths and software to preserve the usefulness of these rich and varied data sets.

"Ten or 20 years ago we might have been able to repeat an experiment. They were simpler, cheaper and on a smaller scale. Today that is not the case. So if we need to re-evaluate the data we collect to test a new theory, or adjust it to a new development, we are going to have to be able to resuse it. That means we are going to need to save it as open data ... "

> Rolf-Dieter Heur 2008 Director General, CERN

First Workshop Scheduled

The first DASPOS Workshop has been scheduled for Thursday - Friday, March 21-22, 2013, at CERN. More information





Data and Software Preservation for Open Science, DASPOS, represents an initial exploration of the key technical problems that must be solved to provide appropriate data, software and algorithmic preservation for HEP, including the contexts necessary to understand, trust and reuse the data. While the archiving of HEP data may require some HEP-specific technical solutions, DASPOS will create a template for preservation that will be useful across many different disciplines, leading to a broad, coordinated effort.

Discovery and Coordination

Series of highly-structured public workshops to define. discuss and document the details of data and software preservation

Prototyping and Experimentation

Key areas of reserach: data and query models and software sustainability models

The DASPOS Team

Computer science experts, experienced digital librarians, and experts in data-intensive fields, such as physics, astrophysics and bioinformatics

Workshop 1

2012-12-17 19:11:04

WORKSHOP 1 Establishment of Use Cases for Archived Data and Software in HEP Date: Thursday-Friday...

Workshop 2

2012-12-17 19:11:04

WORKSHOP 2 Survey of Commonality with other Disciplines Attendees: Broad participation from many...





DASPOS

- Data And Software Preservation for Open Science
 - multi-disciplinary effort funded by NSF
 - Notre Dame, Chicago, UIUC, Washington, Nebraska, NYU, (Fermilab, BNL)
- Links HEP effort (DPHEP + experiments) to Biology, Astrophysics, Digital Curation
 - includes physicists, digital librarians, computer scientists
 - aims to achieve some commonality across disciplines in
 - meta-data descriptions of archived data
 - What's in the data, how can it be used?
 - computational description (ontology development)
 - how was the data processed?
 - can computation replication be automated?
 - impact of access policies on preservation infrastructure

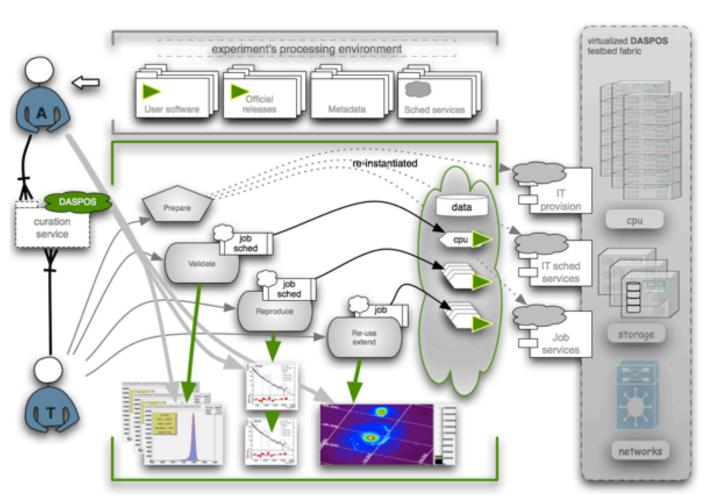


Many different Rs...

- Reproduce precisely what someone else did on the same resources, with the same techniques.
- Recreate an equivalent computation on different resources, with similar techniques.
- Repurpose an experiment by running it again with a slight change to the data, software, or environment.
- Reuse the same artifact across many different experiments, for a longitudinal comparison.
- Rely on one party to set up an environment and make it usable for multiple parties. (Think sysadmins)
- Other Rs?



Curation Challenge





Reproducibility in e-Science is absolutely terrible today!

- Can I re-run a result from a colleague from five years ago successfully, and obtain the same result? How about a student in my lab?
- Today, are we preparing for our current results to be re-used by others five years from now?
- Multiple reasons why not:
 - Rapid technological change.
 - No archival of artifacts.
 - Many implicit dependencies.
 - Lack of backwards compatibility.
 - Lack of social incentives.
 - Lack of transparent tools...



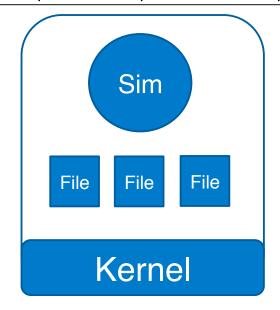
Typical Computational Experiment

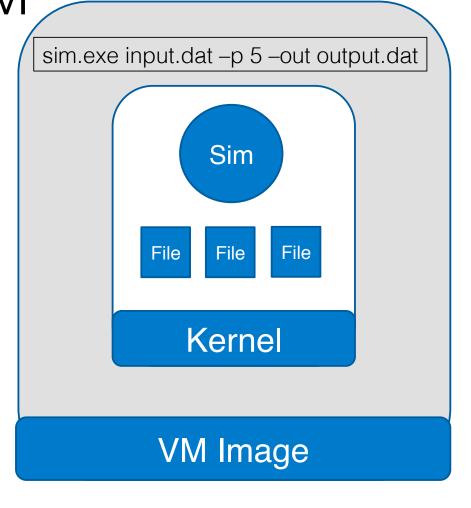
- PI gives student some general directions. Student writes some code, does some experiments, saves the outputs, writes the paper.
- Source code is often carefully curated. But what about the operating system, the software dependencies, the experimental configuration, the input data, etc...
- If we did manage to re-run everything, do we have a means of verifying equivalence?
- Concurrency + Floating Point != Bitwise Equality.



Preserve the Mess: Stick it all into a VM

sim.exe input.dat –p 5 –out output.dat





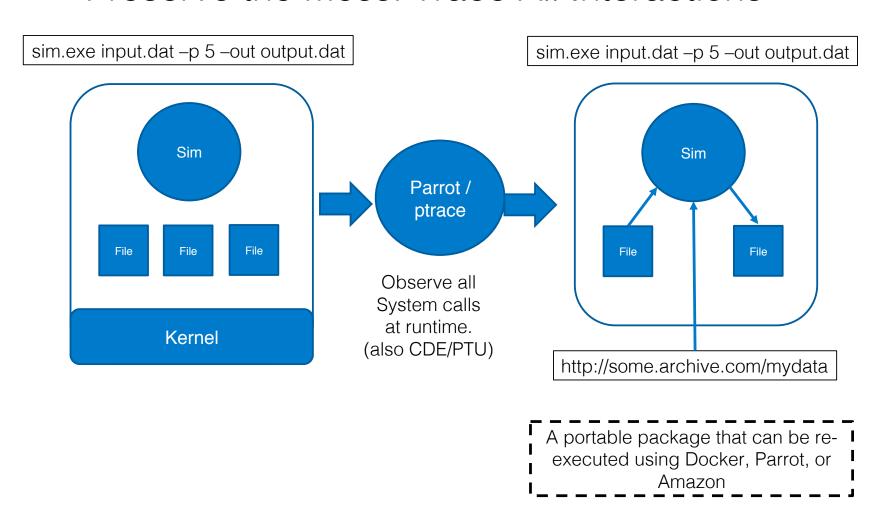


Preserve the Mess: Stick it all into a VM

- A good place to start, however:
 - Captures more things than necessary.
 - For many experiments will duplicate large amounts of software/data in the VM images.
 - Hard to disentangle things logically what if you want to run the same experiment with some component of the OS/software/data changed?
 - Doesn't capture network interactions.
 - May be coupled to specific a VM technology.
 - VMs are not the place to archive data.



Preserve the Mess: Trace All Interactions





Preserve the Mess: Trace All Interactions

- Solves some problems:
 - Only captures what is actually used.
 - Once captured, not coupled to a technology.
 - Observes network dependencies.
- But not all of them:
 - For many experiments will duplicate large amounts of software/data in the VM/package images.
 - Hard to disentangle things logically what if you want to run the same experiment with some component of the OS/ software/data changed.
 - VMs/packages are not the place to archive data.



What we really want:

A *structured* way to compose an application with all of its dependencies.

Enable preservation, but also re-use of data and images for efficiency.

It also would be good to capture the context of the computational experiment.

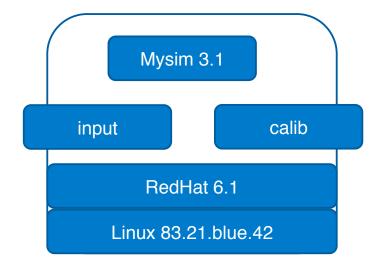


Umbrella

myenv1.json

```
kernel = {
     name = "Linux";
version = "83.21.blue.42"
       opsys = {
    name = "RedHat";
     version = 6.1
      software = {
        simulator = {
    mount = "/soft/sim";
    name = "mysim-3.1";
        data = {
         input = {
    mount = "/data/input";
    url = "http://some.url"; }
         calib = {
    mount = "/data/calib";
    url = "http://other.url"; }
```

umbrella run myenv1.json



Online Data Archives





Umbrella specifies a reproducible environment while avoiding duplication and enabling precise adjustments.

Run the experiment

input1
Mysim 3.1
RedHat 6.1
Linux 83

Same thing, but use different input data.

input2
Mysim 3.1
RedHat 6.1
Linux 83

Same thing, but update the OS

input2
Mysim 3.1
RedHat 6.2
Linux 83

Online Data Archive

RedHat 6.1 input1 input2 Linux 83 Mysim 3.1

RedHat 6.2 calib1 calib2 Linux 84 Mysim 3.2



Specification is More Important than Mechanism

- Current version of Umbrella can work with:
 - Docker create container, mount volumes.
 - Parrot Download tarballs, mount at runtime.
 - Amazon allocate VM, copy and unpack tarballs.
 - Condor Request compatible machine.
- More ways will be possible in the future as technologies come and go.
- Key requirement: Efficient runtime composition, rather than copying. (Compare to Dockerfile.)



How do we construct complex workflows from these building blocks?



PRUNE – Preservation Run Environment

- Problem: Our user interfaces do not accurately capture the dependencies or the environment of the codes that we run.
- Can we improve upon the standard command-line shell interface to make it reproducible?
- Re-use a good idea: functional representation.
 output = mysim(input, calib) USING ENV myenv.json
- Build on ideas from GridDB, VDL, Swift, Taverna, Galaxy, but focus is on precise reproduction, not on performance (coarse granularity.)



PRUNE – Preservation Run Environment

PUT "/tmp/input1.dat" AS "input1" [gets id 3ba8c2]

PUT "/tmp/input2.dat" AS "input2" [gets id dab209]

PUT "/tmp/calib.dat" AS "calib" [gets id 64c2fa]

PUT "sim.function" AS "sim" [gets id fffda7]

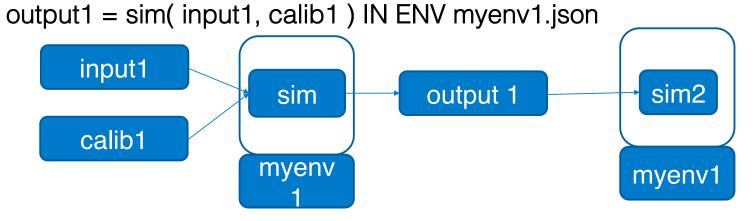
out1 = sim(input1, calib) IN ENV myenv1.json [out1 is bab598]

out2 = sim(input1, calib) IN ENV myenv2.json [out2 is 392caf]

out3 = sim(input2, calib) IN ENV myenv2.json [out3 is 232768]

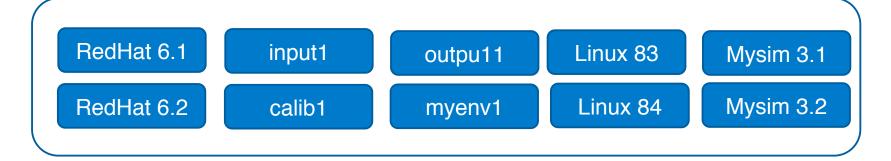


PRUNE connects together precisely reproducible executions and gives each item a unique identifier



Bab598 = fffda7 (3ba8c2, 64c2fa) IN ENV c8c832

Online Data Archive





All Sorts of Open Problems

- Naming: Tension between usability and durability. At least two levels of naming.
- What is the intersection of version control (doc deltas) and provenance (doc ops)?
- Usability: Can we accommodate existing work patterns, or do we force new habits?
- Repositories: Who will run them, how many should we have, what will they cost...? Will they be persistent?
- Compatibility: Can we work in existing workflow technologies without starting over?
- Composition: MPI, BoT, Workflows, Map-Reduce, ...



Big Data for Science

Sensors

Databases

Open Data

Computational models

Experiments

Repositories

Synthesis Interoperability

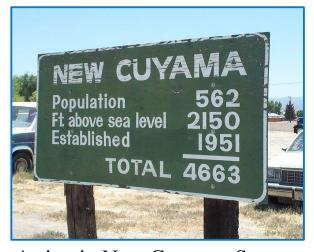
Reproducibility

Understanding Discovery

Preservation



"...it does not answer the question how one would discover the required data in today's chaotic information universe, how one would understand which datasets can be meaningfully integrated, and how to **communicate** the results to humans and machines alike."



A sign in New Cuyama, Santa Barbara County, California; original picture by Mike Gogulski (CC BY 2.5).



Formal semantic models capture these data dimensions and allow them to be **shared** via linked open data principles.





A "design pattern" based approach allows us to create **reusable** "micro-ontologies" or building blocks that have high **quality** and minimize **unintended** logic consequences.

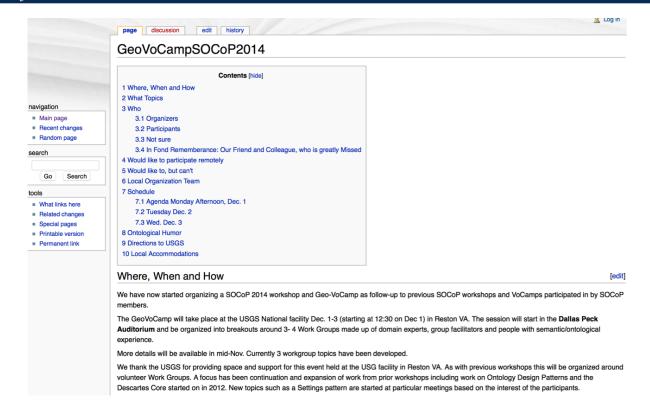


"Linked Open Data for Computational Science?"



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Gary Berg-Cross and David Carral



UNIVERSITY of NOTRE DAME



DaSe Lab, Kno.e.sis Center, Wright State University

David Carral, Adila Krisnadhi, Michelle Cheatham, Pascal Hitzler





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Credit: Beatrice Murch, Creative Commons License, https://www.flickr.com/photos/blmurch/2754681293/sizes/l/

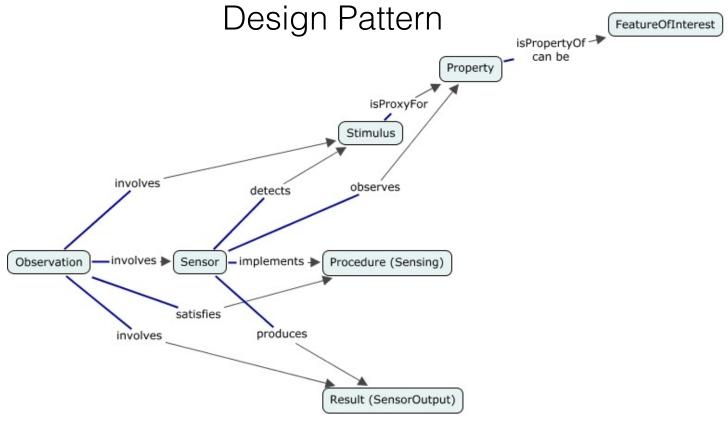


How did you take it's temperature?



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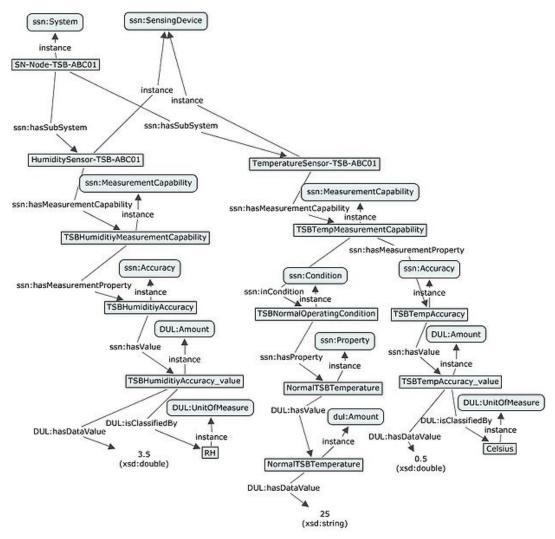
The Stimulus-Sensor-Observation Ontology



SSN: http://www.w3.org/2005/Incubator/ssn/wiki/SSN_Skeleton#The_Stimulus-Sensor-Observation_Ontology_Design_Pattern



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SSN: http://www.w3.org/2005/Incubator/ssn/wiki/Report_Work_on_the_SSN_ontology 41



How might a Computational Scientist take it's temperature?



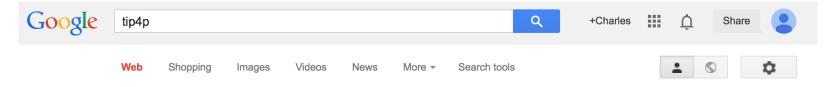
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Temperature

$$T = \frac{2}{3k_B} \left\langle \frac{1}{N} \sum_{i=1}^{N} \frac{|\mathbf{p}_i|}{2m_i} \right\rangle$$



But this definition depends on some **computational** model that captures the molecular behavior of water...



About 685,000 results (0.16 seconds)

Water model - Wikipedia, the free encyclopedia

en.wikipedia.org/wiki/Water_model ▼ Wikipedia ▼

The potential for models such as TIP3P and **TIP4P** is represented by. $E_{ab} = \sum_{i=1}^{t} \text{ (Next{on. where kC, the electrostatic constant, has a value of 332.1 ...$

Simple water models - 2-site - 3-site - 4-site

TIP4P model of water page on SklogWiki - a wiki for ...

www.sklogwiki.org/SklogWiki/index.php/TIP4P_model_of_water ▼

Jan 20, 2011 - The **TIP4P** model is a rigid planar four-site interaction potential for water, ... The **TIP4P** model consists of a Lennard-Jones site for the oxygen ...

Parameters - Phase diagram - Shear viscosity - Virial coefficients

Water models

www.lsbu.ac.uk/water/models.html ▼ London South Bank University ▼ Apr 1, 2014 - Water molecular models including SPC, SPC/E, TIP3P, TIP4P, TIP5P, PPC, POL5 , SSD and SWFLEX.

pair_style lj/cut/coul/long - Lammps

lammps.sandia.gov/doc/pair_lj.html ▼ Sandia National Laboratories ▼ style = lj/cut or lj/cut/coul/cut or lj/cut/coul/debye or lj/cut/coul/dsf or lj/cut/coul/long or lj/cut/coul/msm or lj/cut/tip4p/long; args = list of arguments for a particular ...

[PDF] TIP4P-Ew - Stanford University

www.stanford.edu/.../horn_tip4pEW_2004jcp.pdf ▼ Stanford University ▼ by HW Horn - 2004 - Cited by 557 - Related articles

May 22, 2004 - A re-parameterization of the standard **TIP4P** water model for use with Ewald techniques is introduced, providing an overall global improvement ...

Water model



In computational chemistry, classical water models are used for the simulation of water clusters, liquid water, and aqueous solutions with explicit solvent. These models use the approximations of molecular mechanics. Wikipedia

Related topics

In most water models, the **Lennard-Jones** term applies only to the interaction between the oxygen atoms. Wikipedia **Explore**: Lennard-Jones potential

In-silico (see: water models), cyclic water clusters . . . are found with n = 3 to 60.

Wikipedia

Explore: Water cluster

Feedback



And some **software code** that implements the computational model by **algorithm**...



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OpenMD: http://www.openmd.org



And some **execution** of the code that produces the data needed for an observation...

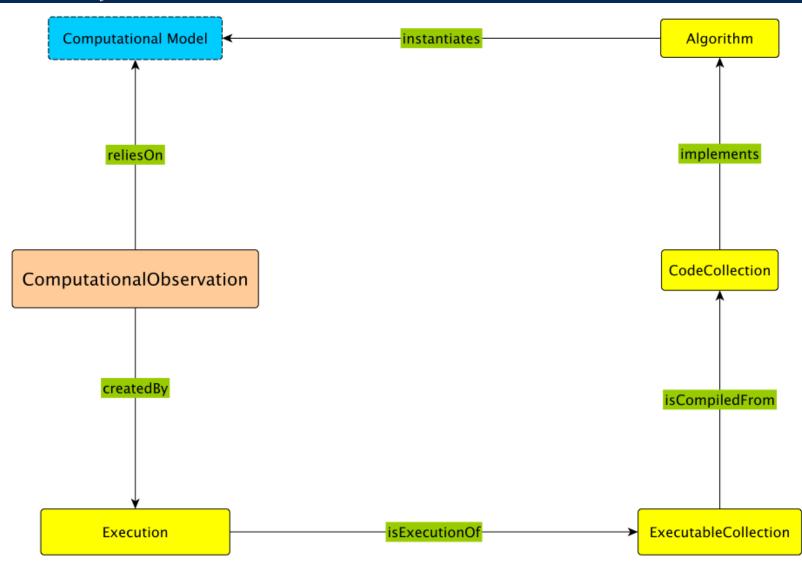


How to Connect "Physical Experimental Observation" to "Computational Experimental Observation"?



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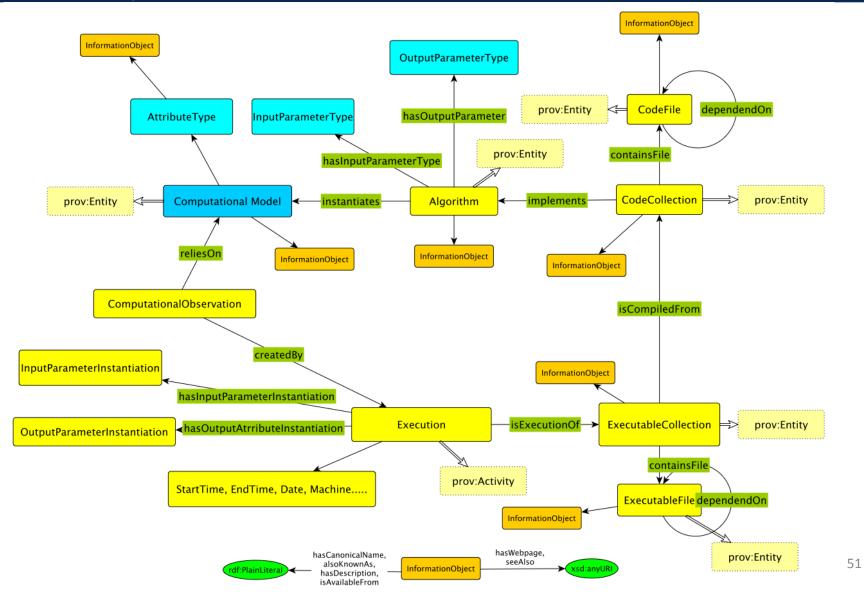
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An Ontology Design Pattern towards Preservation of Computational Experiments

- Demand for scientifically reproducible and extensible preservations of computational experiments.
 - Replication of numeric results vs. Context of the calculation
 - Preservation should be described both in machine and human readable fashions
- Smart Container (SC) ontology towards conceptualizing computational experiments from the perspective of computational environments and activities within using Docker¹ LXC as a preservation tool.



Docker

- Docker Linux container as a scaffolder
- Light-weighted virtualization platform
- Versioned file system
- Modular design for distribution of software component
- A sustainable community(industry, CERN²)

Refer or align existing ontologies and patterns, such as PROV-O³, CSO⁴ and ACT⁵ for discoverability, interoperability, queryability and future extensibility.



Goals and "how?"

- Capture existing scientific workflow frameworks and descriptions with a Docker LXC
- Data to be integrated in a consistent manner
- A common description of a computational environment
- How?
 - An automated tool "wraps" the existing Docker command line
 - An infrastructure is transparent to scientists but also captures information necessary to populate the metadata behind the scenes.



Toward the Formalization of "Smart Containers"

- A modular approach by systematic alignment of concepts present in Docker as a computational environment.
- Reusing vocabulary terms where possible to contextualize computational activities.
- Assist to answer competency questions:
 - 1. "What are the requirements for a computational activity?"
 - 2. "What was the environment in which the activity was performed in terms of software components?"
 - 3. "What is the order in which provisioning activities must occur?"
 - 4. "What software agents are responsible for a particular result or outcome".



Toward the Formalization of "Smart Containers"

- PROV is used as a foundational building block to facilitate connection to other vocabularies and preservation efforts.
- The Core Software Ontology (CSO) formalizing concepts of software engineering, such as data, software and executions with data.
- ACT ontology design pattern provides temporal-ordered entities and a planning-related workflow axioms.



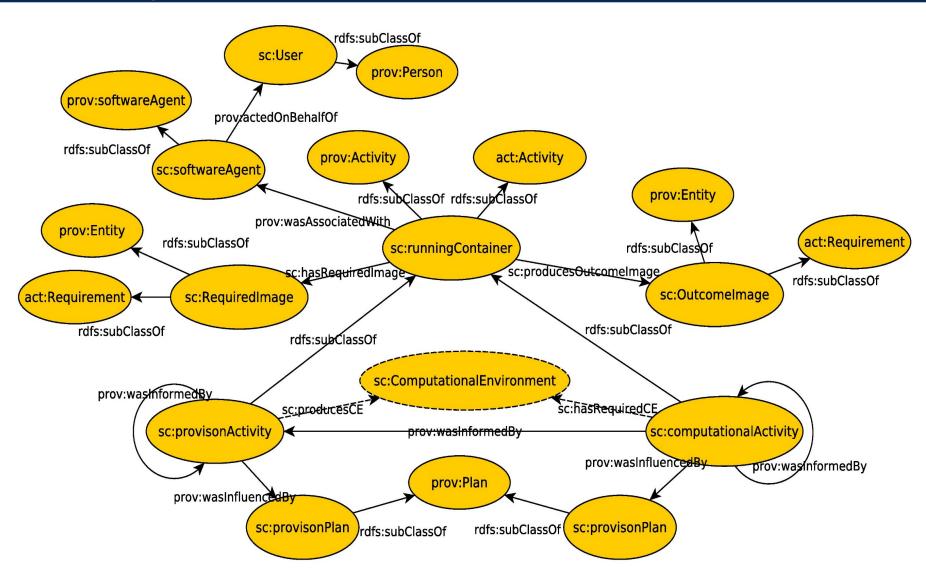
A Proposed Pattern

- **provisioning activities**: create an appropriate environment for computational activities. A sequence of provisioning activities was planned by a **provision plan**.
- computational activities: directly produce scientific observations and affected by a workflow plan
- runningcontainer: a Docker LXC concept that represents an activity hasRequiredImage and producesImage, also was Associated With a software Agent, which actedOnBehalfOf a User
- use rdf:seeAlso to reference the human readable encoding of computational experiment as SoftwareAsCode which is a kind of Information Object



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Smart Container

- Capture ENTIRE computational environment by using a modular, reusable, extensible approach
- The Docker effort provides most of this functionality
 - Sustainable Community
 - Versioned file system
 - Repository for components
- Smart Containers extends Docker by providing the ability to capture provenance and other metadata
- Complimentary to Umbrella and Prune approach. Would like to capture workflow but not entire computational environment for each execution of some software
- Ontology design pattern and use of ontologies provides the ability to understand and extend previous work by capturing the CONTEXT behind the scenes

National Data Service



The National Data Service (NDS) is an emerging vision for how scientists and researchers across all disciplines can find, reuse, and publish data. It builds on the data archiving and sharing efforts already underway within specific communities and links them together with a common set of tools designed around the following capabilities:



News Events



Approved NDS Vision and Charter Documents

At the 3rd NDS Consortium Workshop, the NDS Consortium approved the Shared Vision of Success 🖹 and the Interim Charter 🖺

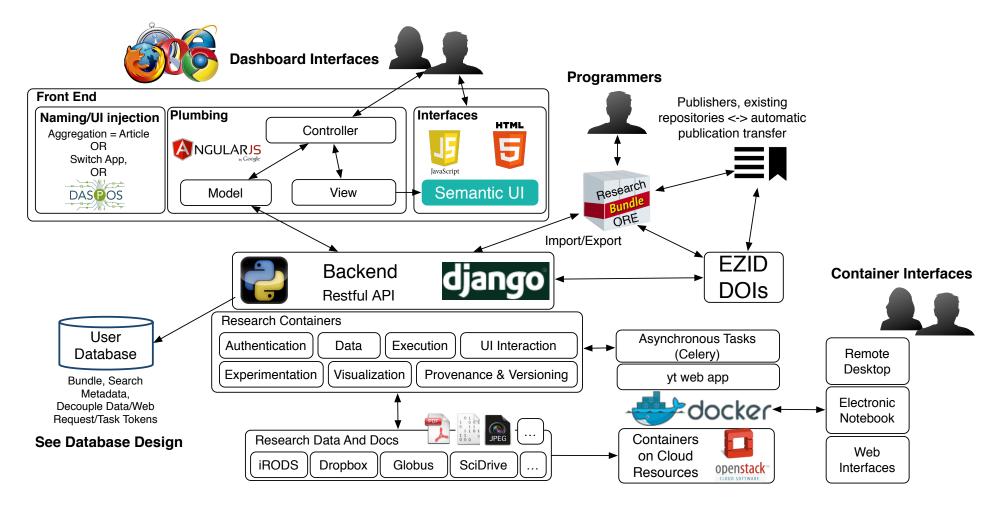
Join the Consortium

A broad assembly of data providers, data aggregators, community-specific federations, academic libraries, publishers, and cyberinfrastructure providers has come together to guide the development and operation of the NDS. Membership is open to all interested projects and organizations.

Find out how you can get involved →



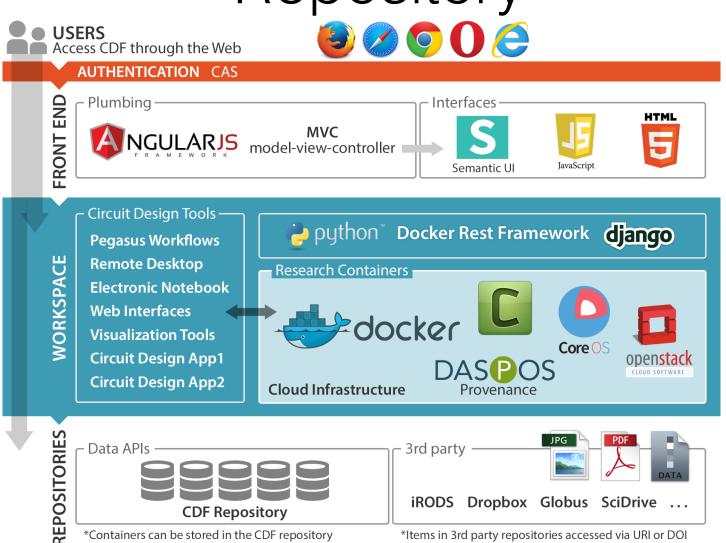
NDS Dashboard



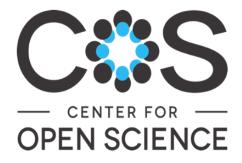
And a video demonstration outlining some of the features can be seen here:

http://ndspilot.com/nds/ndspilot1080p.mp4

Circuit Design Trusted Repository



The Open Science Framework and SHARE





Citation Standards

Data Transparency

Analytic Methods (Code) Transparency

http://cos.io/top

Research Materials Transparency

Design and Analysis Transparency

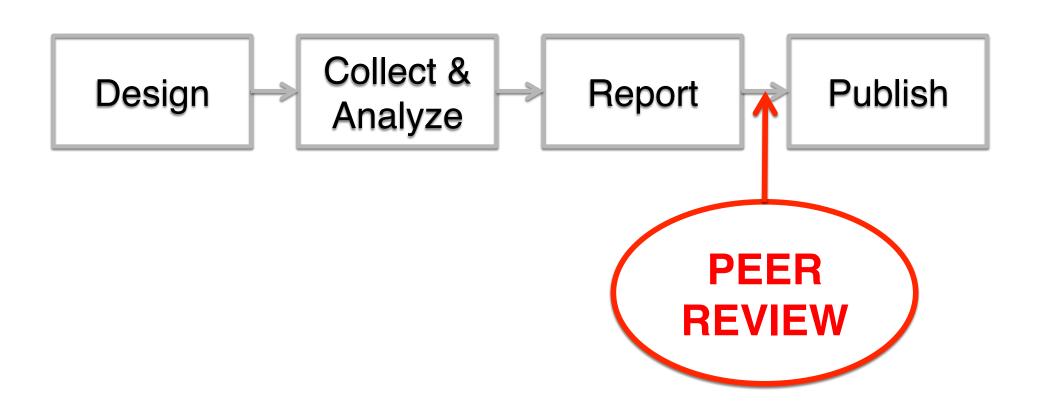
Preregistration of studies

Preregistration of analysis plans

Replication



Registered Reports

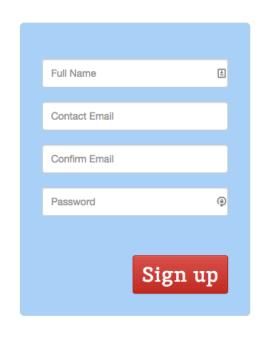


Open Science Framework



Project management with collaborators, project sharing with the public

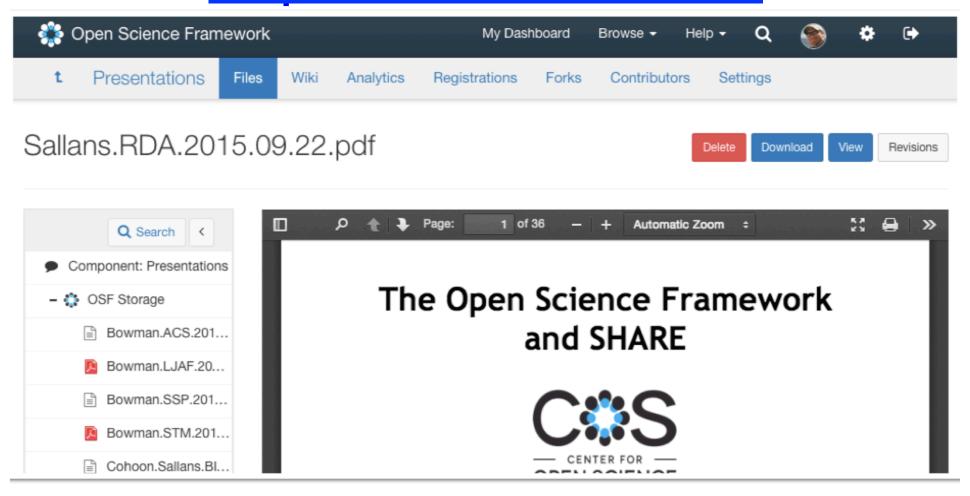
The Open Science Framework (OSF) supports the entire research lifecycle: planning, execution, reporting, archiving, and discovery.



Sign-up now, easy and free!

http://osf.io

Find more on COS/OSF at https://osf.io/habxc/



Questions: contact@cos.io

Final remarks

- Computer scientists, in collaboration with librarians and domain scientists, can do a lot together to support science integrity and open science efforts.
- Reproducibility is not about technology only.

Acknowledgements





Graduate students



Haiyan Meng is leading work on Parrot and Umbrella.



Peter Ivie is leading the work on PRUNE.



Da Huo is leading work on Smart Containers

Collaborators, contributors to this talk



Prof. Doug Thain CSE @ND ccl.cse.nd.edu (provided slides on Umbrella and PRUNE)



Dr. Charles Vardeman crc.nd.edu (provided slides on CS Open Linked Data)



Prof. Michael Hildreth Physics@ND

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The Cooperative Computing Lab

Software | Download | Manuals | Papers

About the CCL

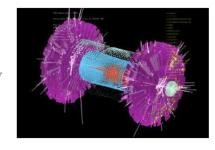
We design <u>software</u> that enables our <u>collaborators</u> to easily harness <u>large scale distributed</u> <u>systems</u> such as clusters, clouds, and grids. We perform fundamental <u>computer science research</u> in that enables new discoveries through computing in fields such as physics, chemistry, bioinformatics, biometrics, and data mining.

CCL News and Blog

- · Creating Better Force Fields on Distributed GPUs with Work Queue
- · CCTools 4.3 released
- · Work Oueue Powers Nanoreactor Simulations
- · Open Sourcing Civil Engineering with a Virtual Wind Tunnel
- · DeltaDB A Scalable Database Design for Time-Varying Schema-Free Data
- Packaging Applications with Parrot 4.2.0
- CCTools 4.2.0 released
- DeltaDB at IEEE BigData 2014

Community Highlight

Scientists searching for the Higgs boson have profited from Parrot's new support for the CemVM Filesystem (CVMFS), a network filesystem tailored to providing world-wide access to software installations. By using Parrot, CVMFS, and additional components integrated by the Any Data, Anytime, Anywhere project, physicists working in the Compact Muon Solenoid experiment have been able to create a uniform computing environment across the Open Science Grid. Instead of maintaining large software installations at each participating



institution, Parrot is used to provide access to a single highly-available CVMFS installation of the software from which files are downloaded as needed and aggressively cached for efficiency. A pilot project at the University of Wisconsin has demonstrated the feasibility of this approach by exporting excess compute jobs to run in the Open Science Grid, opportunistically harnessing 370,000 CPU-hours across 15 sites with seamless access to 400 gigabytes of software in the Wisconsin CVMFS repository.

- Dan Bradley, University of Wisconsin and the Open Science Grid

Research

- Papers
- Projects
- People
- Jobs
- REU

Software

- Download
- Manuals
- Makeflow
- Work Queue
- Parrot
- Chirp
- SAND
- AWE

Community

- Highlights
- Annual Meeting
- Workshops
- Getting Help
- Mailing List
- For Developers

Operations

- Condor Display
- Condor Pool
- Hadoop Cluster
- Biocompute
- BXGrid
- Condor Log Analyzer
- Internal



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