

## *GoldenTrail*: Retrieving the Data History that Matters from a Comprehensive Provenance Repository

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IDCC

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# Prologue: DCC “REPRISE” workshop, 2009

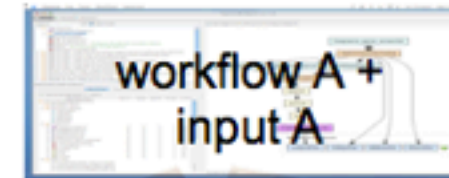
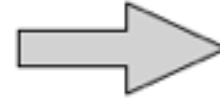
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1824

## Full-fledged data-mediated collaborations

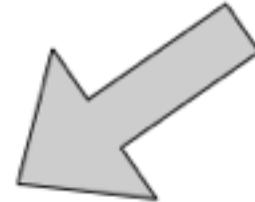
The University  
of Manchester



exp. A

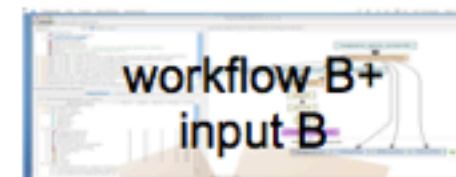
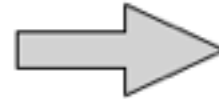


Research  
Object  
A



result A → input B

exp. B



Research  
Object  
B

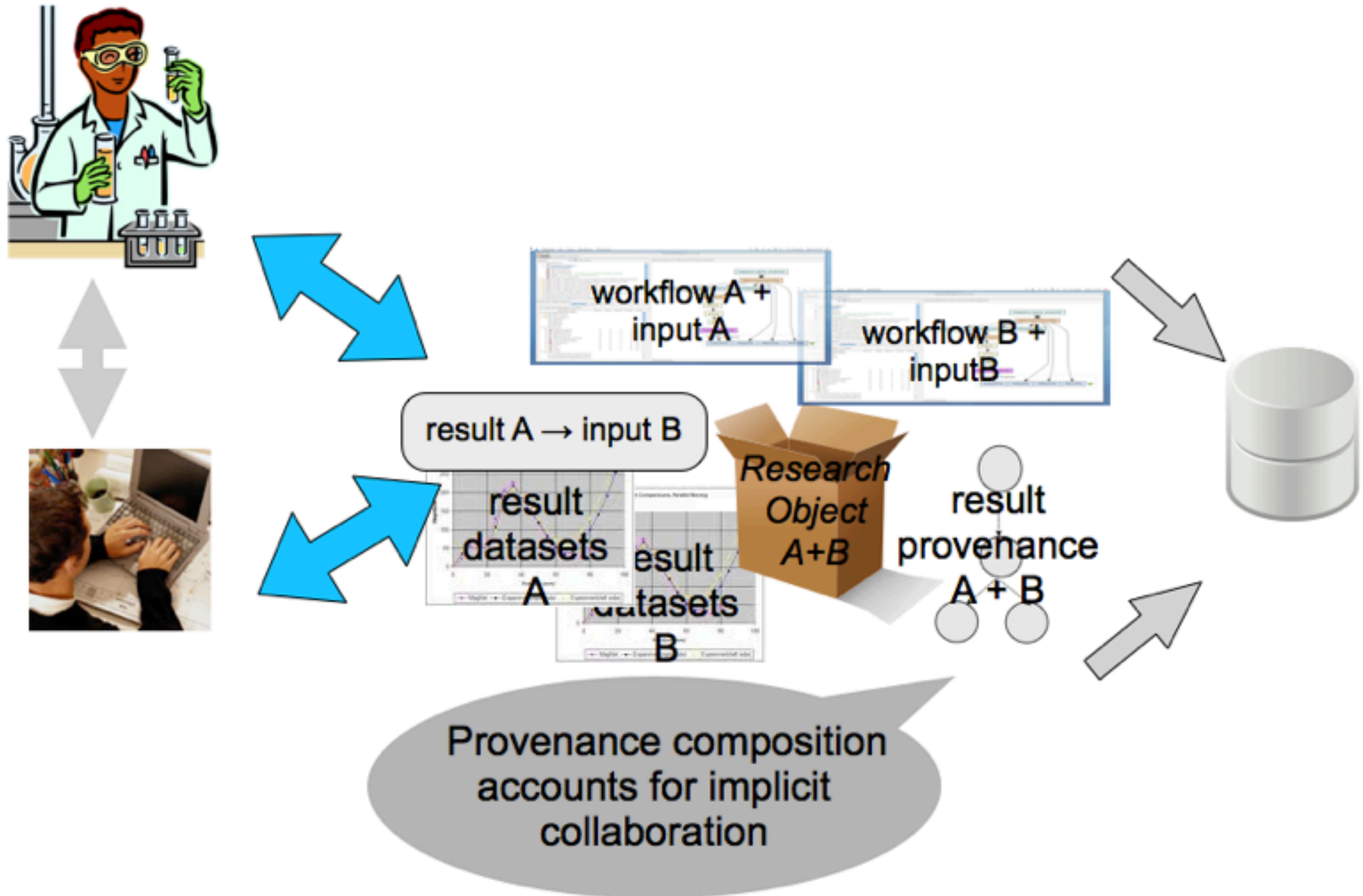


# “Virtual experimental science” (DCC’09)

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## Full-fledged data-mediated collaborations

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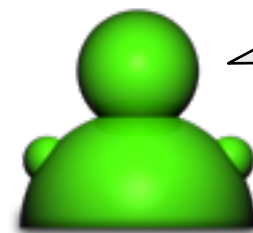
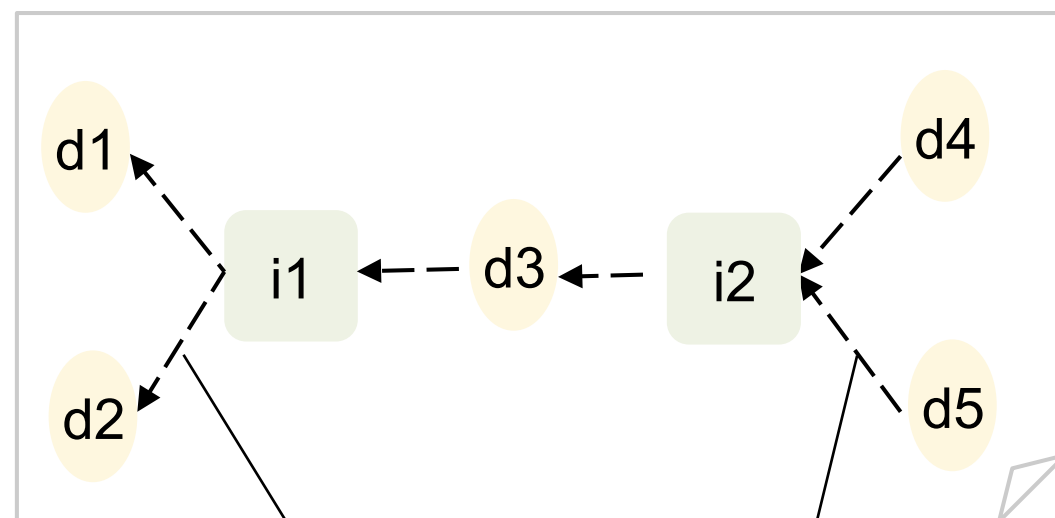


# Provenance in the experimental science lifecycle

A provenance trace is an account of the history of a data item through multiple processing steps

- Instrumental to verification and reuse of results -- Trustworthiness
- Enabler for “reproducible science” [1]

provenance trace (graph)



how did d4 come to be?  
what other datasets contributed to it?  
which processes were involved?

i1 used d1 and d2

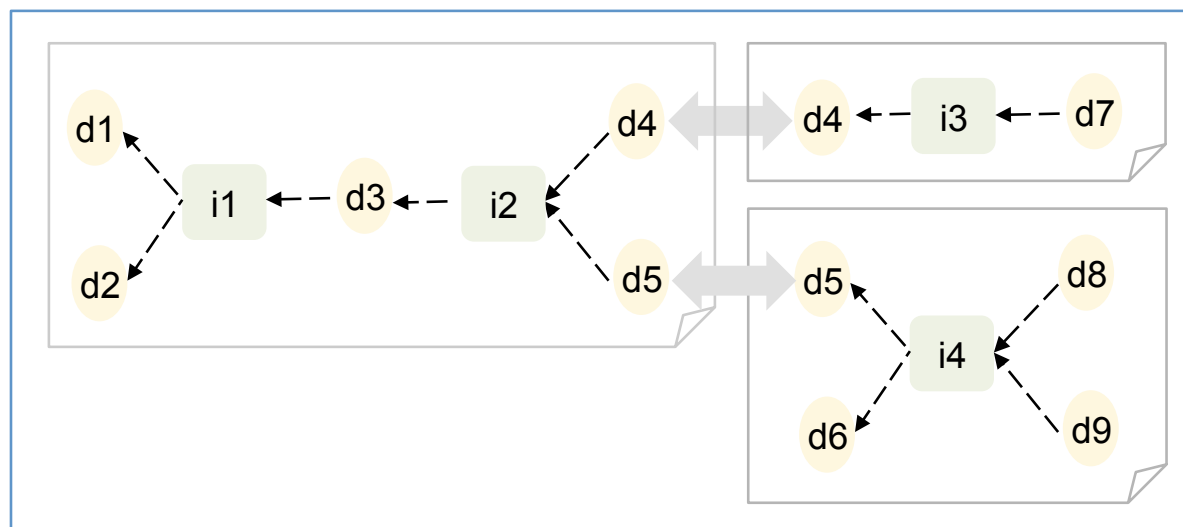
d4, d5 were generated by i2

[1] Mesirov, Jill, P. (2010). *Accessible Reproducible Research*. **Science**, 327.  
Retrieved from [www.sciencemag.org](http://www.sciencemag.org)

# Prior work on provenance composition

## 2010: the DataTree Of Life summer project [2]

- Provenance *stitching*:
- Multiple, independently produced provenance traces expressed using the Open Provenance Model (OPM) can be “joined up” on shared datasets
- provided the data resides in a provenance-aware data repository.



## Limitations:

- automated “stitching” requires data ID mapping and provenance-aware data copy operations
- in general, it requires human intervention

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[2] Missier, P., Ludascher, B., Bowers, S., Anand, M. K., Altintas, I., Dey, S., Sarkar, A., et al. (2010). *Linking Multiple Workflow Provenance Traces for Interoperable Collaborative Science*. Proc.s 5th Workshop on Workflows in Support of Large-Scale Science (**WORKS**).

- Experimental science is explorative and evolutionary
  - many experiments, few will succeed
  - from parameter sweeps to changes in methods
- E-science infrastructure should be able to capture the exploration process in addition to the “good” results
  - Implicit collaboration becomes “just” a special scenario



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    - Implicit collaboration becomes “just” a special scenario
- **Golden Data**: the dataset(s) that scientists decide to share/publish
  - **Golden Trail**: an account of how the Golden Data was obtained
    - a view over the provenance of the entire experiments history
    - describes a virtual experiment

# Approach: a generalized *provenance base*

## PBase Requirements

- Account for multiplicity of
  - workflow specifications and runs
  - workflow models
  - users
- Capture details of every execution into a persistent provenance repository
- Let scientists upload new provenance traces
- Support the provenance stitching process interactively
- Support queries on the provenance base to compute Golden Trails



# Goal and associated technical challenges

## Goal:

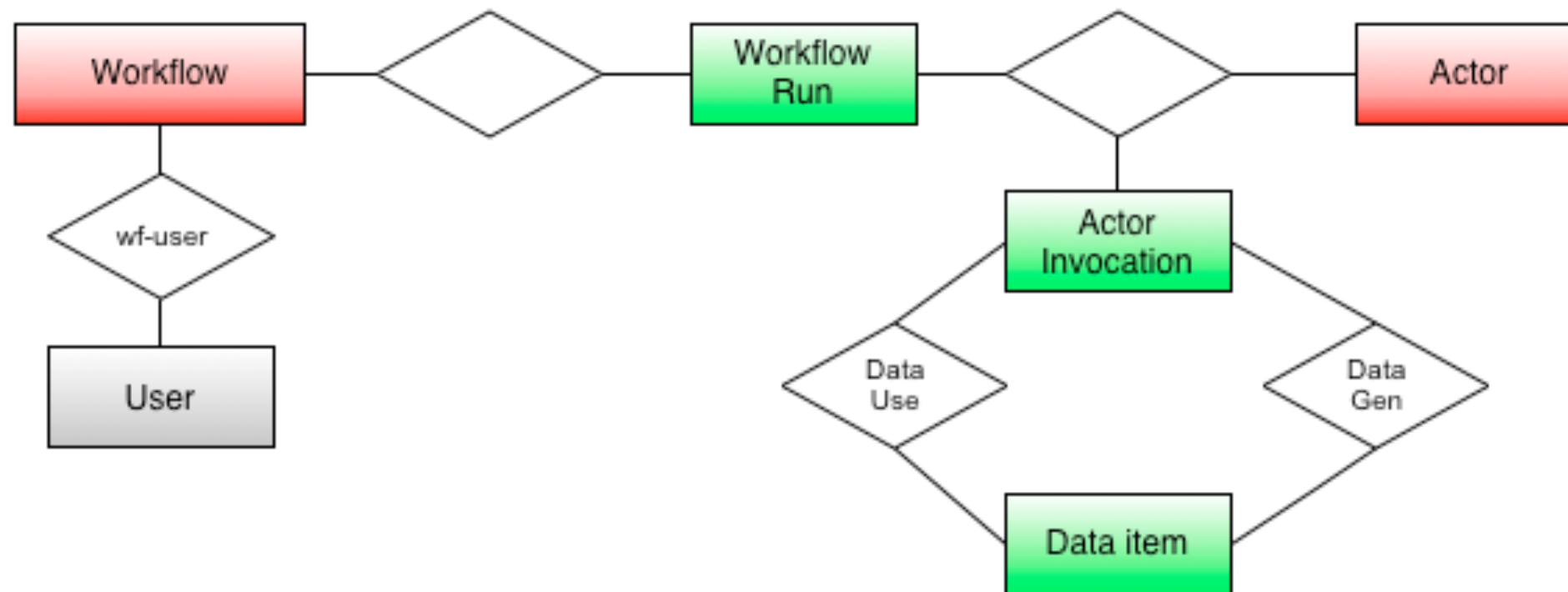
To offer an extensible framework for building PBase

- The Open Provenance Model is adequate for describing traces of workflow execution: “trace-land”
  - to be superseded by PROV-DM, currently W3C Public Working Draft (\*)
- But we also need to record workflow specifications: “**workflow-land**”
  - by supporting multiple heterogeneous workflow models
  - e.g. ASKALON, Galaxy, Kepler, Taverna, Pegasus, Vistrails, etc.
  - currently only **Kepler** (UCSD, UC Davis), **Taverna** (myGrid, UK) supported
- Integration with the **DataONE** data preservation architecture
  - Provenance base as a new type of *Member Node*

(\*) FPWD as of October, 2001: <http://www.w3.org/TR/2011/WD-prov-dm-20111018/>

# D-OPM - a minimal model

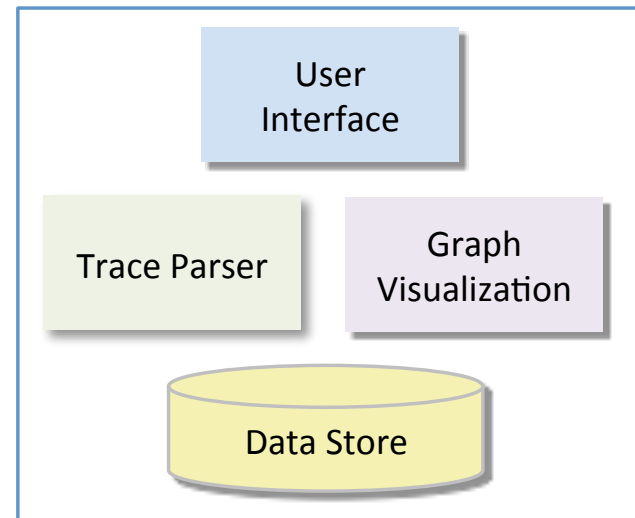
- Trace-land inspired by the OPM
- Workflow-land inspired by Janus [1]



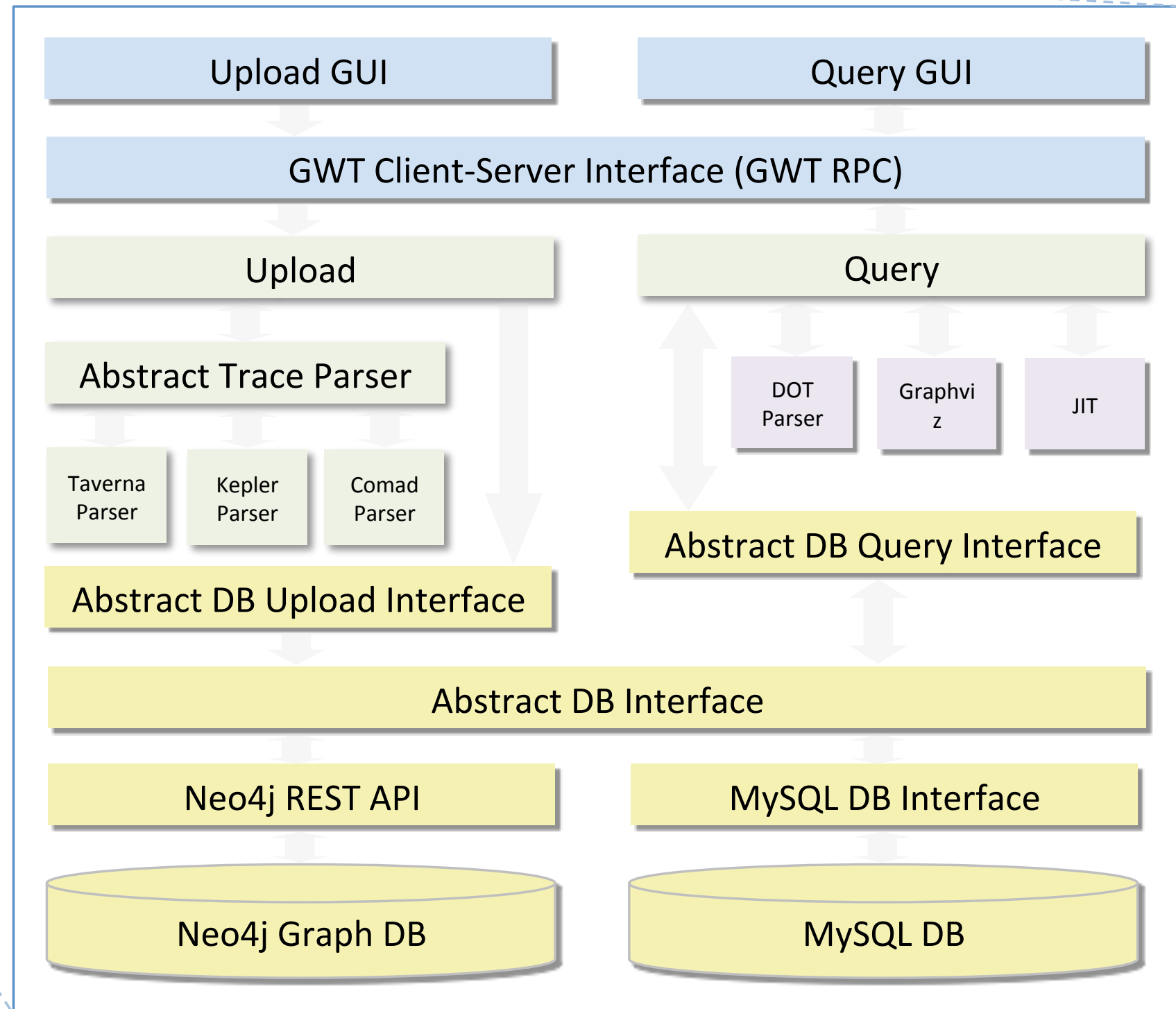
- Actor, a single computational step within a workflow
- Run: a single execution of an entire workflow
- Actor invocations: executions of individual steps that either Use or Generate Data Items
- Attribution: reference to users who run the workflow and thus “own” the traces.

[1] Missier, P., Sahoo, S. S., Zhao, J., Sheth, A., & Goble, C. (2010). Janus: from Workflows to Semantic Provenance and Linked Open Data. Procs. IPAW 2010. Troy, NY.

# GoldenTrail PBase architecture



- UI: upload a new trace
- Trace Parser
  - maps native formats to D-OPM
- Graph Visualization
  - displays provenance graphs
- Data Store: provenance store



- Exploit the synergy between workflow-land and trace-land

## Data-level and actor-level queries

Ancestor / Descendant queries  
(backwards / forward traversal)

Find all **Actors** that  
contributed to /  
impacted the  
generation of D

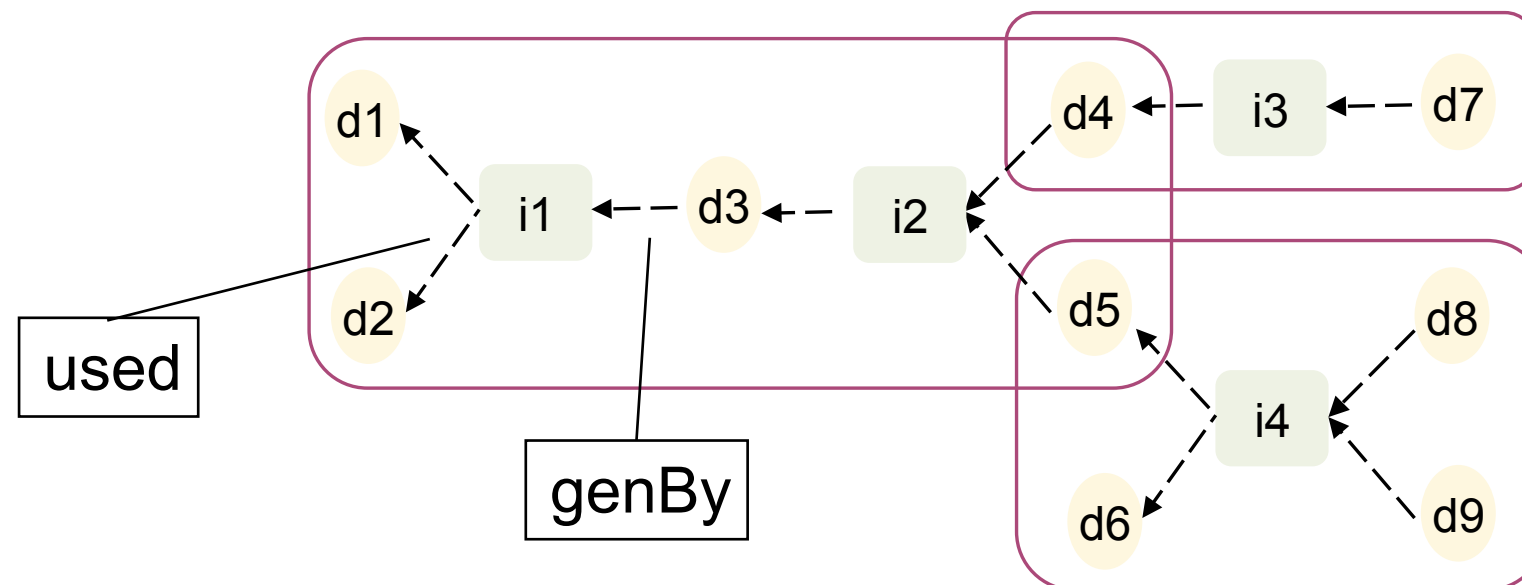
Find all **data D'**  
that contributed to /  
impacted the  
generation of D

## Workflow-level queries

Find all data that flowed  
through a workflow W  
during one run R

## User-related queries

Find all data items  
used / generated on  
behalf of a user





**Upload** Query Results

User Name:

Workflow Name:

Workflow System: Kepler

File: Choose File no file selected

Upload

Provide user name  
and the workflow  
name

Workflow system  
(e.g. Kepler, COMAD,  
Taverna, etc)

Browse the trace file  
to be loaded



UploadQueryResults

Provenance Type: Invocation Provenance

Dependency Type: Data + Invocation Dep

Node Type: Input

Node Value: d1

Input Node Value: d1

Orientation: End At

+

Execute

Clear

View Graph

Node	Value	Tag	Remove
Output	d3	Start With	X
Invocation	i1:1	Through	X
Input	d1	End At	X

Select provenance detail level and dependency type

Filter results using conditions

Add additional conditions

Query conditions

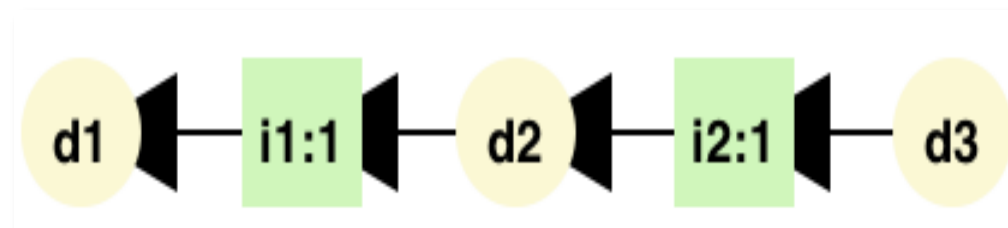




Upload	Query	Results
Start Node	End Node	Type
d1	i1:1	Input
d2	i2:1	Input
i1:1	d2	Output
i2:1	d3	Output

In tabular format

In graphical format



- GoldenTrail: a “Provenance Base” for workflow-related datasets
  - across users
  - across workflow models
  - across sessions
  - dedicated provenance model and query layer
- State:
  - early prototype completed (summer 2011) [1]
- Ongoing work within the DataONE project, Provenance Working Group
  - PBase to be integrated into DataONE as Member Node
  - Ongoing engagement with the scientific workflow community
    - get buy-in on the PBase idea
    - collect feedback on current prototype
    - collect additional use cases