# Revealing the Detailed History of Script Outputs with Hybrid Provenance Queries

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## **Motivation**

- Data- and Workflow-Provenance are crucial for transparency and reproducibility in computational and data-driven science.
- Scientific workflow systems (Kepler, Taverna, ...) provide both prospective provenance (the workflow graph) and retrospective provenance (runtime observables).

# Challenges

- Most computational analyses and workflows are conducted using **scripts** (Python, R, MATLAB, bash, ...) rather than workflow systems.
- Retrospective Provenance Observables, e.g., from DataONE RunManagers (file-level), ReproZip (OSlevel), or noWorkflow (Python code-level) only yield isolated fragments of the overall data lineage and processing history.
- Prospective Provenance could be used to link and contextualize fragments into a meaningful and comprehensible workflow, but scripts alone do not reveal the underlying workflow graph.
- Provenance (like other metadata) appears to be rarely actionable or immediately useful for those who are expected to provide it (provenance is "for others").

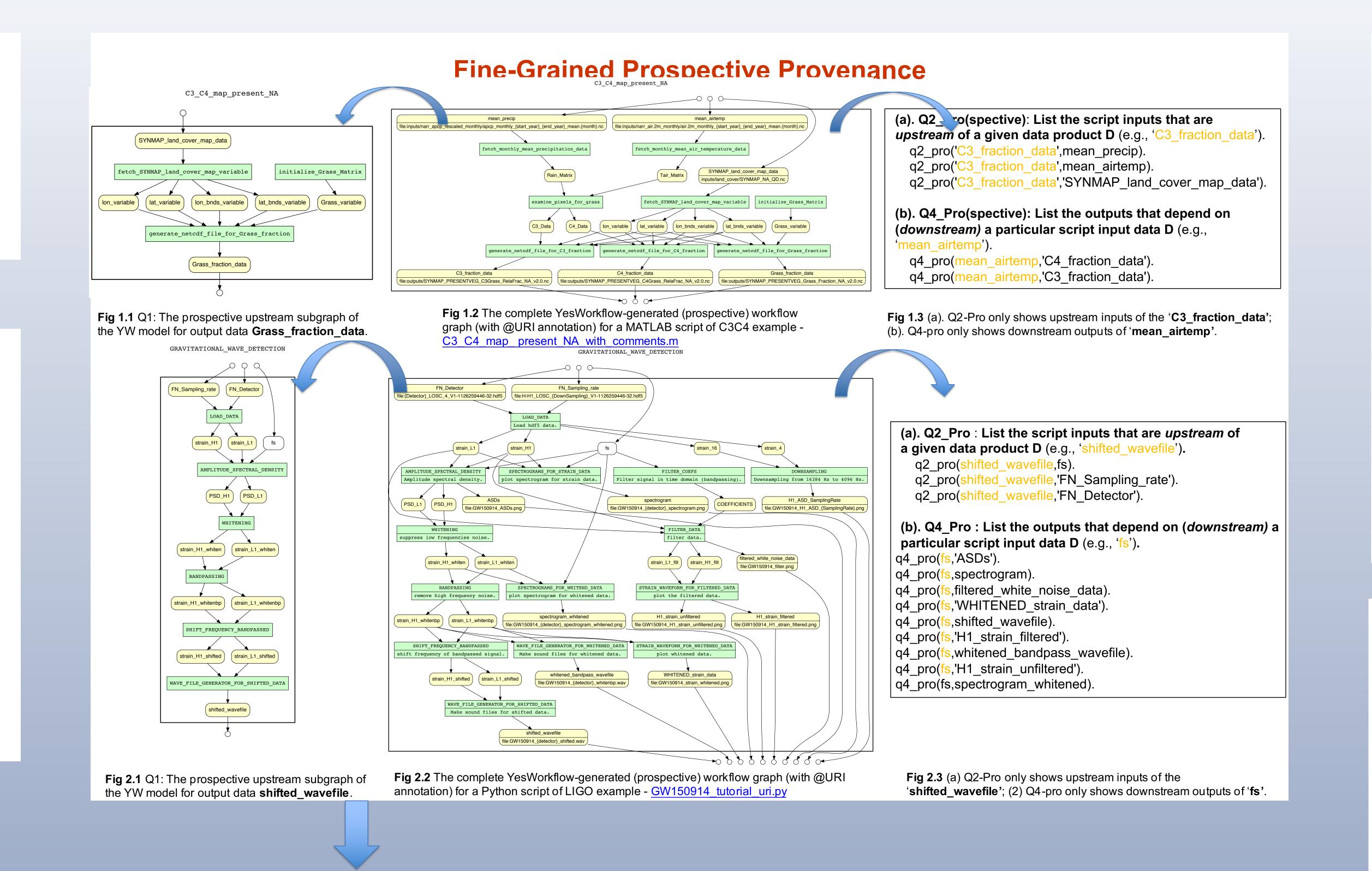
# Approach

Simple YesWorkflow (YW) annotations allow users to reveal workflow (prospective provenance graph) implicit in scripts.

- Prospective provenance queries to expose and test data dependencies at the workflow level.
- Hybrid provenance queries that situate runtime observables (retrospective provenance) in the overall workflow, yielding meaningful knowledge artifacts.
- Easily share comprehensible workflow graphs and customizable provenance reports for script runs, along with data, code in scientific studies ("provenance for self").

#### **Demo Queries**

- Q1/Q3 (prospective query): Render prospective upstream/downstream subgraph of the YW model of the script for a given output data product D.
- Q2/Q4 (prospective query): List the script inputs that are upstream/downstream of a given data product D
- Q5 (hybrid query): Render retrospective graph with with concrete filename for a given output data product

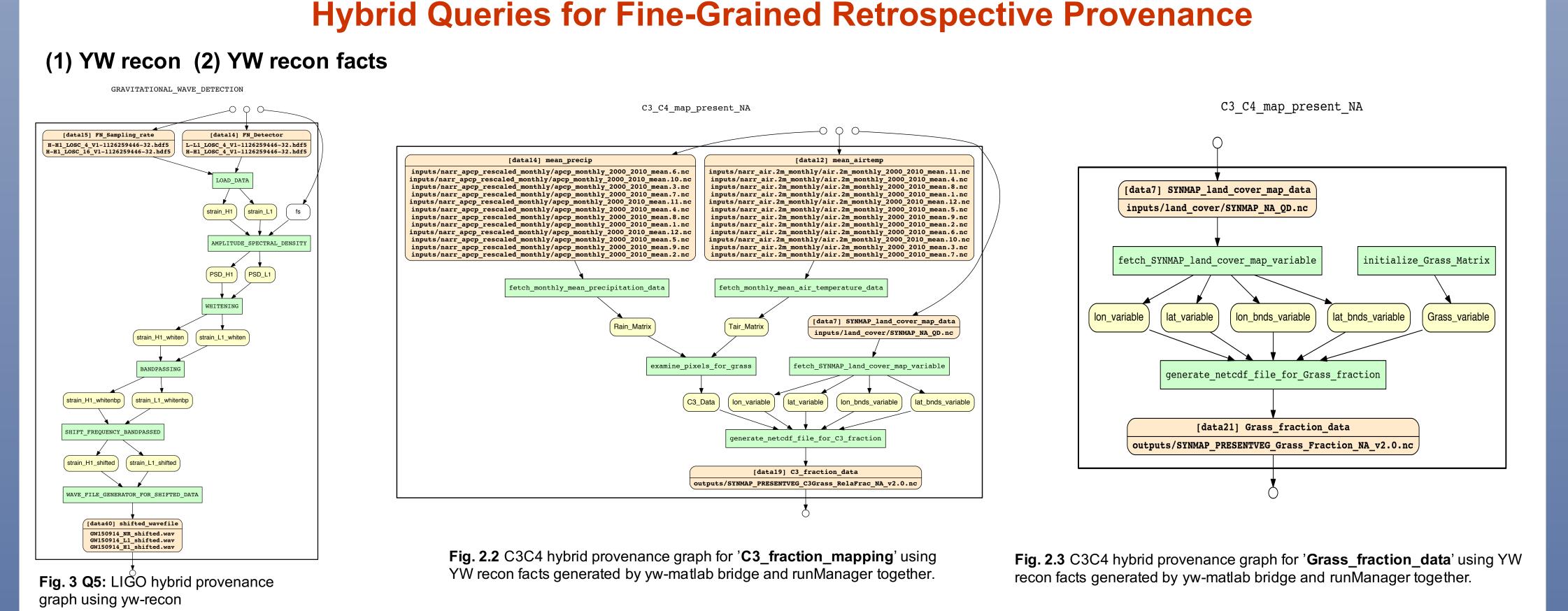


#### Run Reconstruction

- YW recon
- YW recon facts

### Coarse and Fine-Grained Observations of Runs

- Matlab Run Manager -> list of files input or output
- YesWorkflow -> list of files matching @URI annotations
- noWorkflow -> values assigned to variables



# **Conclusions and Future Work**

- Provenance from script runs can be revealed graphically and made actionable (e.g., to yield customizable data lineage reports) via (1) simple YW user annotations, (2) linking runtime observables (e.g. DataONE RunManager, ReproZip, noWorkflow), and (3) sharing provenance artifacts and executable queries.
- Extend YW to facilitate querying log files for hybrid provenance at data level.
- Extend YW toolkit to support other (optional) workflow modeling constructs (e.g., simple control-flow to complement dataflow); to support graph pattern queries; to support project-level provenance.
- Evolve ProvONE to support project-level provenance and graph queries.

#### References

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Acknowledgments. Supported by NSF awards ACI-1430508 and NSF ABI-1262458.











