



# Work at ISI 2014 Collaboration with LONI Group

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## About me

- 3<sup>rd</sup> year PhD student at Universidad Politécnica de Madrid
  - Supervisors: Oscar Corcho, Yolanda Gil.
- Knowledge representation and Semantic Web.
  - Ontologies, Linked Data, RDF, etc.
- eScience, reproducibility, reuse.
- Third time at ISI with Yolanda



- Workflow **representation**

- Plan/template representation
- Provenance trace representation
- Link between templates and traces

**CH1:** Can we export an abstract template of the method being represented?

**CH2:** How do we interoperate with other workflow results?

**CH3:** How do we access the workflow results?

**CH4:** How do we link an abstract method with several implementations?

- Creation of **abstractions/motifs** in scientific workflows

- Abstraction **catalog**
- Find how different workflows are related

**CH5:** How can we detect what are the typical operations in scientific workflows?

**CH6:** How can we detect them automatically?

- **Understandability and reuse** of scientific workflows

- Relation between the workflows involved in the same experiment  
(**Research Objects**)

**CH7:** Which workflow parts are related to other workflows?

**CH8:** How do workflows depend on the other parts of the experiments?

- As a **designer: Discovery**

- Workflows with similar functionality fragments/methods
- Design based in previous templates.

- As **user/reuser: Understandability, Exploration**

- Search workflows by functionality
- Commonalities between execution runs
- Component categorization
- Workflow summarization



# 1. Workflow fragment detection in the LONI Pipeline

- [Integration](#) of previous work with the LONI Pipeline.
- [Evaluation](#) against 3 different corpora
- User-based preliminary evaluation

# 2. Study on workflow reuse

- Series of [interviews](#) with LONI pipeline users
- [Survey](#) on workflow reuse
- [Discussion](#) of the results

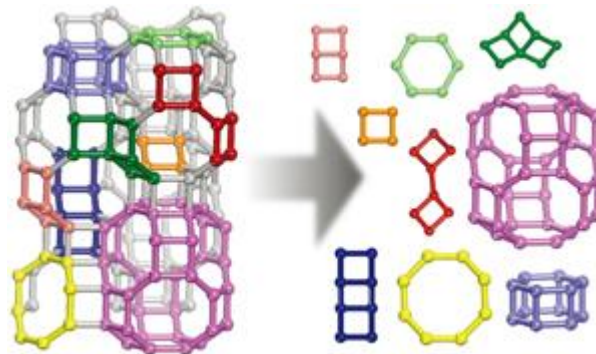
# Workflow fragment detection in the LONI Pipeline

Problem statement:

*Given a **repository of workflows**, what are the **workflow fragments** I can deduce from it?*

Useful for:

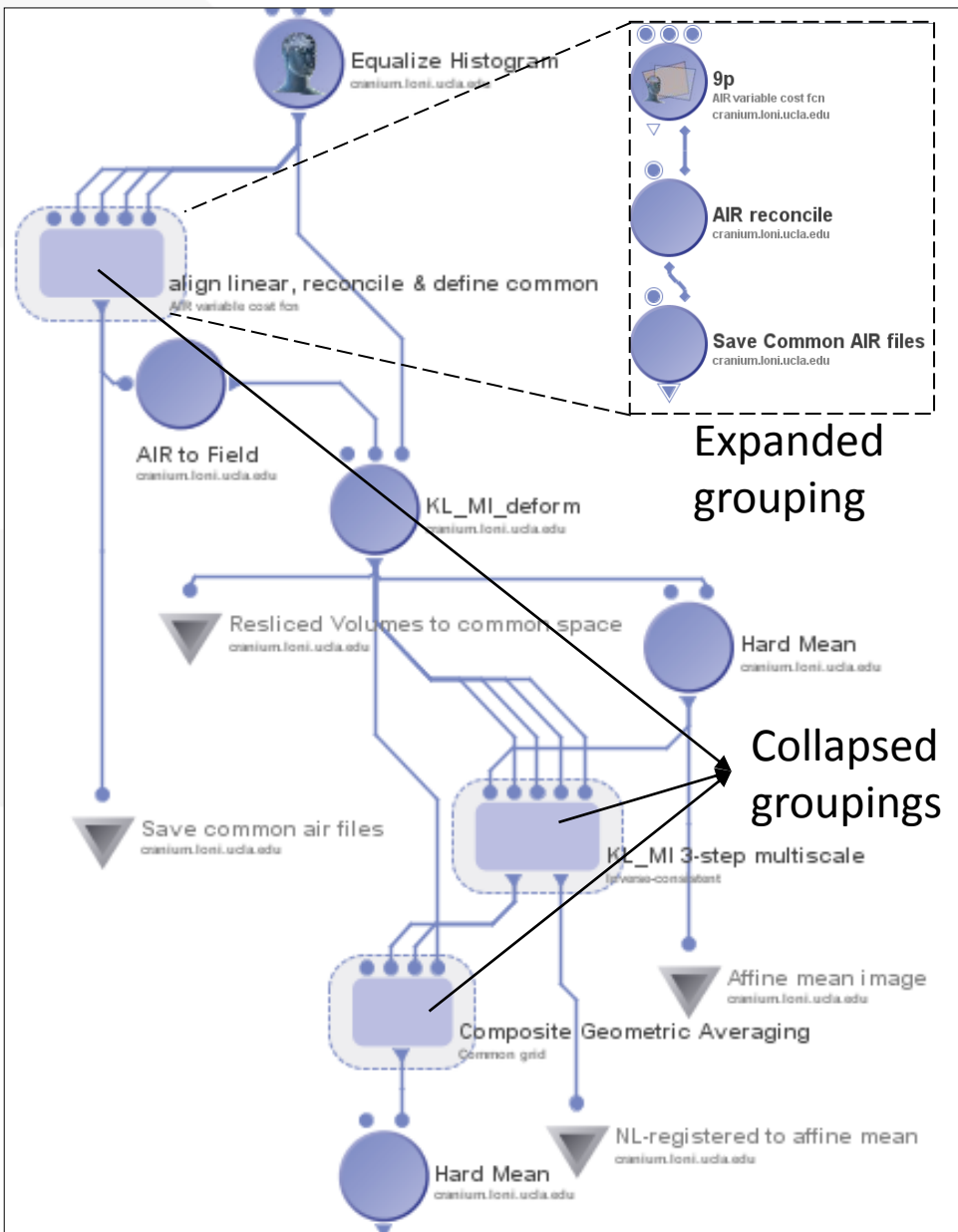
- Finding relationships between workflows and sub-workflows.
  - Most used fragments, most executed, etc.
  - Workflow cloud of reused fragments.
- Proposing new templates with the popular fragments.
- Summarizing existing workflows using popular fragments.





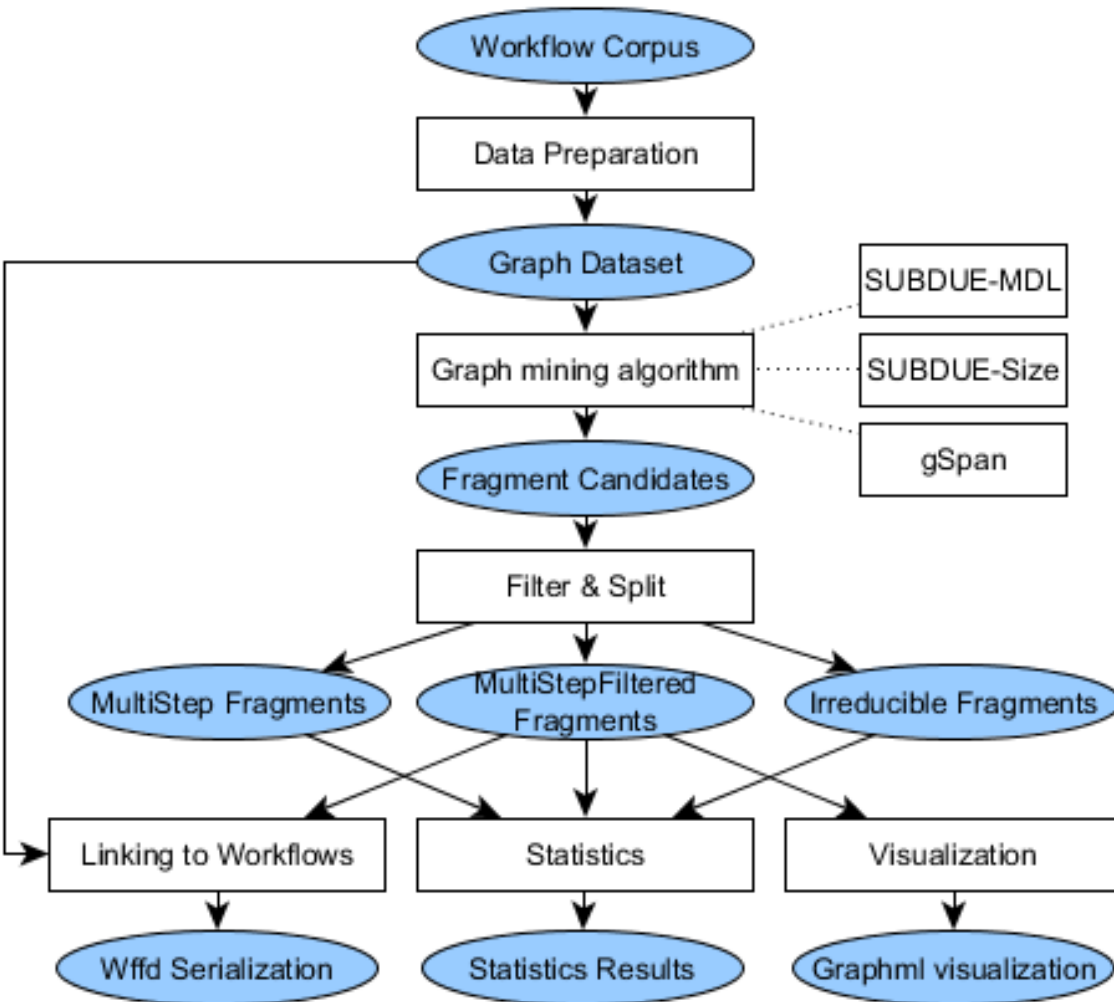
- Given a collection of workflows, which are the **most common fragments**?
  - **Common sub-graphs** among the collection
    - Sub-graph isomorphism (NP-complete)
- We use 2 different algorithms to find the fragments
  - The **SUBDUE** algorithm [**Holder et al 1994**] (hierachical clustering)
    - Inexact Frequent Graph Matching (some fragment candidates might be not returned)
    - Graph based hierarchical clustering
      - Each **cluster** corresponds to a workflow fragment
    - Iterative algorithm with two measures for compressing the graph:
      - **Minimum Description Length** (MDL)
      - **Size**
  - **gSpan** (<http://www.cs.ucsb.edu/~xyan/software/gSpan.htm>)
    - Exact Frequent Graph Matching (all possible fragments are returned)
  - More algorithms to come!

[Holder et al 1994]: **Substructure Discovery in the SUBDUE System** L. B. Holder, D. J. Cook, and S. Djoko. AAAI Workshop on Knowledge Discovery, pages 169-180, 1994.



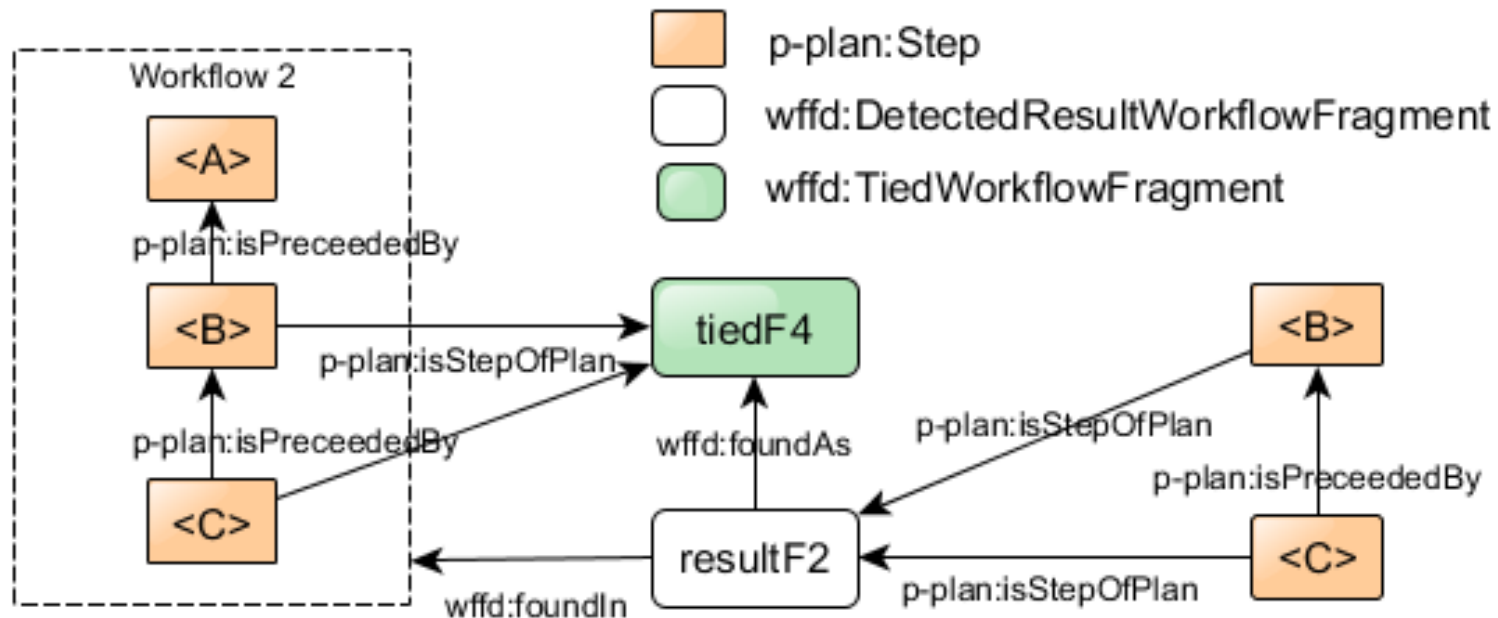
## LONI Pipeline:

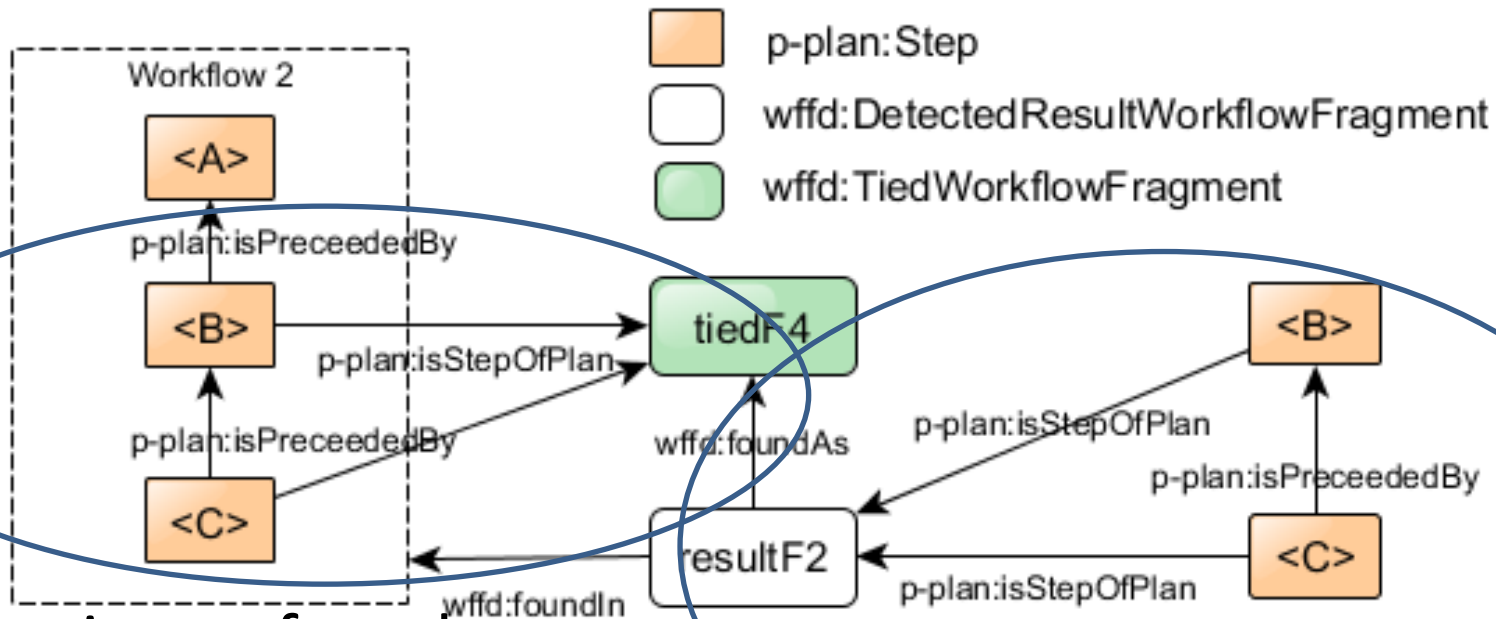
- Workflow system for neuroimaging analysis
- Many workflows recorded and published
- Workflows are likely to reuse parts of other workflows (common library of components)
- Users can group sets of steps to organize, simplify and reuse workflows (groupings).



The data has to be prepared, and the results filtered.

1. A **data preparation** step filters duplicate workflows and remove single step workflows
2. The **graph mining** algorithm calculates fragment candidates
3. Fragment candidates are **filtered** to simplify the final results.
4. Results are **linked** back to workflows and visualized.





Where it was found

What we found

### Evaluation:

- 3 different corpora:

- WC1: single user corpus, with 475 different unique workflows
- WC2: single user corpus (plus collaborations with others), with 96 different unique workflows
- WC3: multi user corpus, with 357 different workflows from 62 users.  
Submitted to the LONI Pipeline during January, 2014

We measure our results by **comparing them against the groupings defined by users**

Metrics defined:

$$P(\text{Exact}) = \frac{|\text{FragFlow Frag} \cap (\text{LONI Gr.} \cup \text{LONI wfs})|}{|\text{FragFlow Frag}|}$$

$$R(\text{Exact}) = \frac{|\text{FragFlow Frag} \cap (\text{LONI Gr.} \cup \text{LONI wfs})|}{|(\text{LONI Gr.} \cup \text{LONI wfs})|}$$

We also **relaxed** the previous metrics to measure if there was an overlap from the common detected fragments and the user defined groupings.

## Results

- 30% to 75% of the total fragments found correspond directly to user defined groupings in the single user corpora.
- In the multi user corpus, the best results are 50% to 56% with minimum frequency. If we consider the overlap of 80% of the steps, the precision is 40% to 80%.
- Users find our proposed fragments as useful candidates for groupings, and therefore useful for reuse in their workflows

<i>User</i>	<i>Use as proposed</i>	<i>Use with minor changes</i>	<i>Use with major changes</i>	<i>Not use</i>
User1 (WC1)	11%	16,6%	38%	33,3%
User 2 (WC2)	44%	6%	50%	0%



# Survey on workflow and grouping reuse

### Interview with users

- What are the **main benefits of using workflows** and groupings in the LONI Pipeline?
  - Sharing workflows with collaborators
  - Time savings
  - Teaching
  - Visualization
  - Design for modularity
  - Design for understandability
  - Design for standarization
  - Design for debugging
  - Paper writing
  - Reproducibility and inspectability

## Interview with users

- Types of users in the LONI Pipeline

- Developers**: usually write components, develop programs and create workflows. Usually bioinformaticians and engineers.
- Beginner programmers**: can write small scripts and program spreadsheets for statistical analysis. They mainly reuse workflows from others. Typically, they are neuroscientists.
- Non-programmers**: cannot write code. They reuse workflows from others. Typically students.

## Survey with 30 questions

- 25 responses recorded (from the LONI pipeline group at USC).

## Main findings:

- Writing code is considered very important for this area of research. Sharing code is not considered as important.
- The majority of responders found the workflow system useful.
- Creating workflows is very useful, but the reuse of workflows was not seen as useful.
- Workflows are useful for both nonprogrammers and for teaching new students.
- Reusing groupings from one's own work is more useful than reusing groupings from others. Groupings help simplify workflows. Groupings save time and also make workflows more understandable by others.
- Workflows are not systematically linked to publications. Most responders believe that the link between a workflow and a publication is kept in private laboratory notes

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- Ontology Engineering Group (UPM)
  - Daniel Garijo, Oscar Corcho
- Information Sciences Institute (USC)
  - Yolanda Gil, Varun Ratnakar
- Laboratory of Neuro Imaging
  - Boris A. Gutman, Neda Jahanshad, Xue Hua, Derrek Hibar, Meredith Braskie, Zhizhong Liu, Paul Thompson and Arthur W. Toga
- University of Michigan School of Nursing
  - Ivo Dinov





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