







Dynamically composed unit tests for data and data analysis

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### Outline of the problem

- Database of analysis results (IACHECdb), the objects
- Scientific software available and documented, the arrows:
  - Github, gitlab (almost no metadata)
  - ASCL (metadata includes domains)
- Goal simplify finding software, feeding it with data and executing it, by adopting formal models for formulating and evaluating data analysis workflows (~pipelines), to:
  - Allow to find (also automatically), define and execute
     some calibration and verification workflows
  - Help automating execution over diverse distributed resources
    - bring code to the data storage or data stream
    - code and data to the CPUs (cloud and grid)

input ImageBins

BinEventsImage Imagin

ii\_skyimage

Workflow with an input

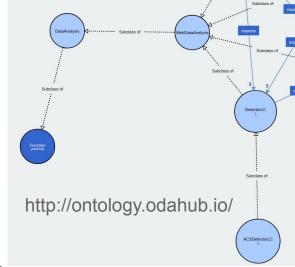
#### Example

- Crab : may be integrated into routine analysis pipeline
  - a. INTEGRAL yields new spectrum
    - New observations
    - New software or calibration
    - New reference models
  - b. The workflow composition engine identifies Crab cross-calibration workflow
  - c. Fetches last available cross-calibration data e.g. from the IACHEC db
  - d. Tries different workflows with different methods (xspec, spex, 3ml) and instruments, proliferating sharing and re-use of good methods
  - e. Summarize and allow for review, public or private

 Vela X-1, Her X-1: variable sources with complex spectra, in addition, require adoption of source knowledge to extrapolate non-simultaneous data

#### What is needed to enable this

- Develop interfaces for adopting standards (VO, etc)
   wrapping data analysis methods in process model
- Define input/output type ontology: classify data entities
- Astronomers embed source knowledge in verification workflows
- Experts in methods (statistical, etc) help to define process



# Why this is becoming feasible now

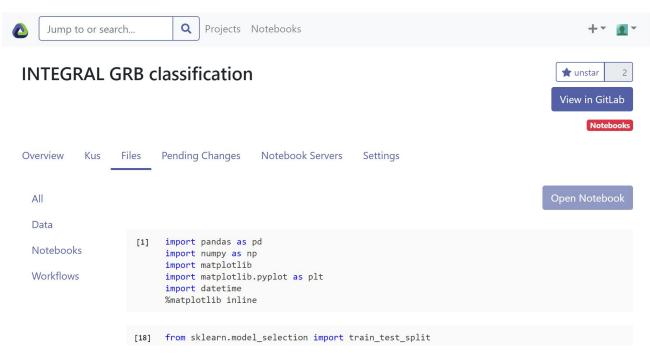
- Development of portable cloud-native technologies allows to execute easily
- Needs in systematic workflow and data management promoted new standards across the industry (CWL, OWL, ...)
- Process as first-class entity is becoming popular: serverless, cloud, etc

## Platforms for sharing and exploiting Data Analysis

github/binder, Renku (SDSC/EPFL), KNIME, SEPP (ESA), ...

#### https://renkulab.io/

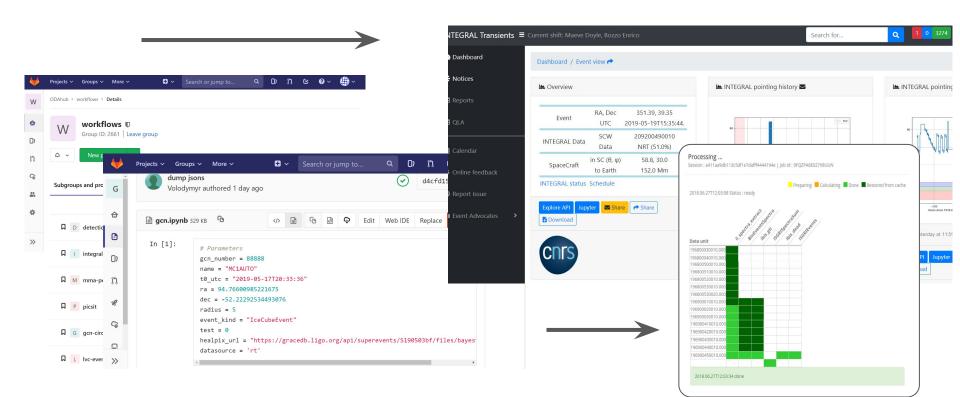
- Sharing
- Searching
- Executing
- reusing (building from) workflows



# Simple example: INTEGRAL transient analysis



A collection of transient analysis workflows is defined by instrument and domain experts, single interface allows shift to get the best results fast

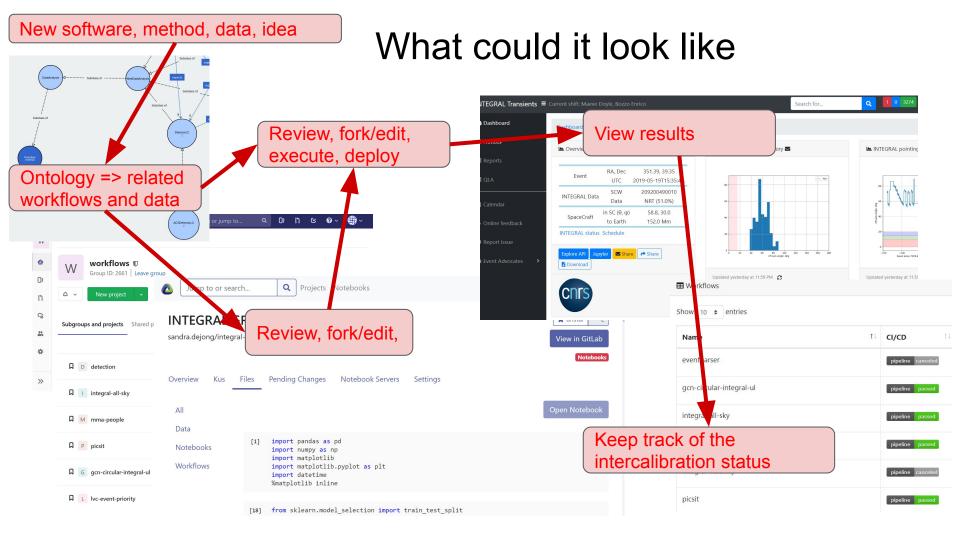


## Many benefits of managed workflows

- Provenance derived from the workflows induces data rights and credits for data and calibrations
- Automation of verification promotes consistency, and while it does not replace specialist analysis, it allows to ease the routine and enable processes discouraged by being boring
- Failed regular automated check might even mean science (like variable hard X-ray Crab), but more likely problem. Worth checking if it costs almost no man-hours.
- Adapters between data formats and interfaces are implemented with workflow
- Meaningful sharing/open impies explaining, provenance gives a perspective on explaining calibration
- If calibration itself can be embedded workflow, it is possible to track impact of cross-calibration impact on the informativeness of the results

GetEcorrCalDB.v0 spectral\_bins\_62 BinMapsSpectra.v2

**Provenance** 



# Open (Online) Data Analysis / CDCI

Online analysis s implemented for INTEGRAL (IBIS, JEM-X) and POLAR: serves as source of INTEGRAL data for the calibration as well as for executing (cross)calbration workflows stored in github

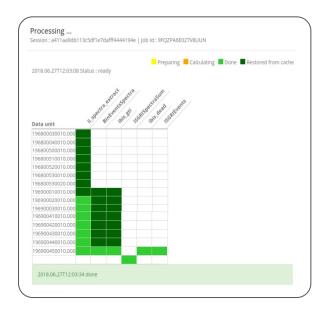
https://astro.unige.ch/cdci/astrooda\_

# ISDC Quick-Look Analysis

As INTEGRAL data arrives to ISDC, Quick Look Analysis is performed, including checks of calibration sanity. It could use more elaborate cross-calibration







#### What is a workflow

- Workflow is an arrow in the process category, a morphism of the data
- Workflow may be a composition of other workflows

