# Towards a computer-interpretable actionable formal model to encode data governance rules

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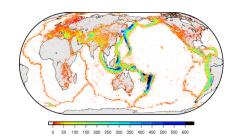


#### Outline

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  - Current practice
  - Observed problems
  - Current solutions (or not)
- Organizing data-sharing collaboration
  - Operational systems
  - Potential solutions
- 3 Our work
  - Design
  - Example
- 4 Future



# Data-sharing collaboration



Depth (km)



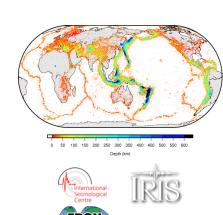


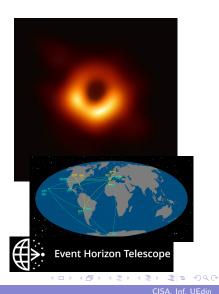






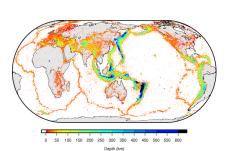
# Data-sharing collaboration





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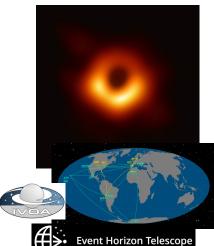
# Data-sharing collaboration













# Current practice

#### Data-sharing and more:

- Data
- Method
- Code
- (Re-)Execution



# Current practice

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- Data
- Method
- Code
- (Re-)Execution

#### Different organizational forms:

- Centralized
  - Single-institutional
  - Cross-institutional
- Federated

### Current practice

#### Data-sharing and more:

- Data
- Method
- Code
- (Re-)Execution

#### Different organizational forms:

- Centralized
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# Observed problems

- Shredded
  - Hard to trace back
  - Hard to receive update
  - Hard to reuse
- "Random" data use
  - Unintended data leaks
  - Violating T&C from the data providers



### Current solution... of *shredded*

- Workflow + standardized description language (e.g. CWL)
- Provenance record
- Research portal / scientific gateway



### Current solution... of "random" data use

- Sensitive data
  - Restricted environment
  - Extra training

- Non-sensitive data
  - Very basic or no policy (open data)

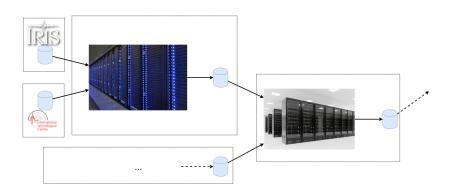
#### Current solution... of "random" data use

- Sensitive data
  - Restricted environment
  - Extra training
  - Long rigorous approval procedure
- Many stages & data in between middle ground
  - No systematic support available
- Non-sensitive data
  - Very basic or no policy (open data)
  - Hidden rules
  - ⇒ Polarized, wasted effort and accidents



Operational systems

### Re-think the big picture



# Proposed strategy

- Encode data-use rules
- Explicit
  - for humans
  - for computers
- Precise
- Computer-aided compliance

Formal model for data policies (i.e. governance rules)
+
Supporting framework



### Language model requirements

- Human comprehensible
  - Easy to author
  - Easy to understand
- Computer interpretable
  - (Critical)
- Transformation needed?



# Solution space

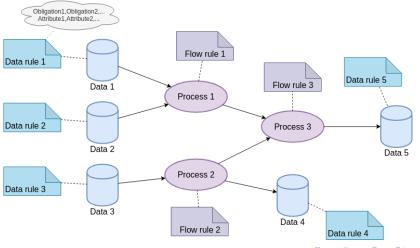
|                   | P. COOLL | /e),80 <sub>7</sub> | Cond |
|-------------------|----------|---------------------|------|
| Preventative      |          |                     |      |
| Post-hoc analysis |          |                     |      |
| Real-time prompts |          |                     |      |

# Solution space

|                   | /c.j.80/<br>/e.j.80/ | Jones |
|-------------------|----------------------|-------|
| Preventative      |                      |       |
| Post-hoc analysis | 0                    |       |
| Real-time prompts |                      |       |

Our work

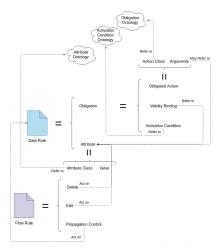
### Let rules <u>flow</u> with data and change with processing



### Use ontologies for interoperability

- Ontologies for different purposes
  - Obligation type
  - Attribute class
  - Activation condition

Rule propagation control



Our work

### Provenance as input

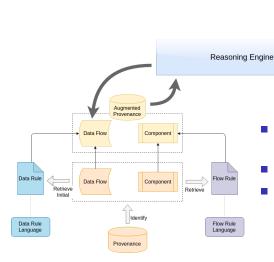
#### Why provenance?

- History
- Standardized
- Extensible
- Interoperable

#### Provenance provides

Integrated information flow from systems, software and tools

### Working rule compliance checker



- Extend datasets: arrive with data rules
- Processes have flow rules

Compliance Analysis

 Intermediate & output datasets have <u>inferred</u> rules

### Example: simple yet complicated

Data providers often want data users to...

Account data use: "Report the number of times you use our data."

#### Example: simple yet complicated

"Report the number of times you use our data."

#### Define use:

- every time as input to a process
- when as initial input
- when resulting in a successful result

#### Define *report time*:

- whenever a new use occurs
- when finished



### Example encoding

Report the number of times you use our data *every time* as input to a process

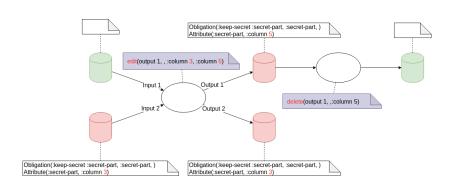
```
Obligation (: report : source , : Source , : WhenAsInput)
Attribute (: source , "some—source")
```

Report the number of times you use our data when as *initial input* 

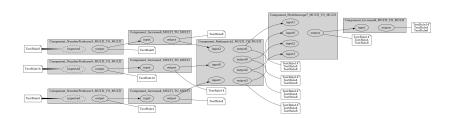
```
Obligation (:report :source, :source, :WhenImported)
Attribute (:source, "some—source")
```

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#### Flow Rule

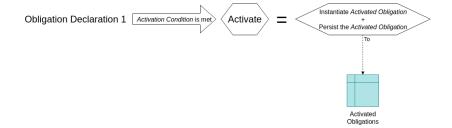


# Merge



Our work 000000000

#### Activation



#### Future work

- Improve logical foundation
- More rule forms
  - wider range of use cases
- Supporting systems
  - operational integration & tools





### Question time & Acknowledgement

# Questions?

Special thanks to Christian Pagé, Wim Som de Cerff and Luca Trani who replied to our initial survey, to Alessandro Spinuso who provided testing provenance database (and helped the survey) and to everyone who provided help.



#### Activation - extra

