

# Data Provenance for SHACL

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# SHACL

- **S**hapes **C**onstraint **L**anguage
- Constraint language for RDF graphs
- Conformance checking

:BookShape

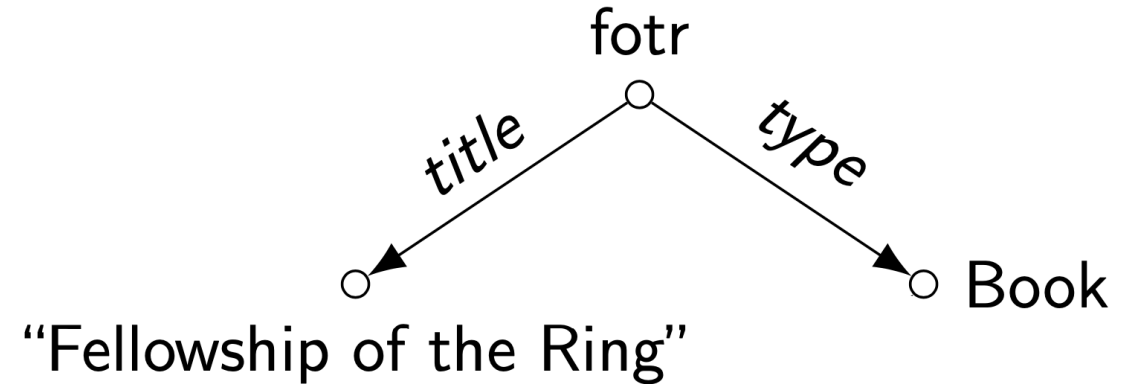
  a sh:PropertyShape;

  sh:path :title;

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$\geq_1 \text{ type. Book} \subseteq \geq_1 \text{ title. T}$



# Shapes

Let  $N, P$  and  $S$  be disjoint universes of node names, property names and shape names.

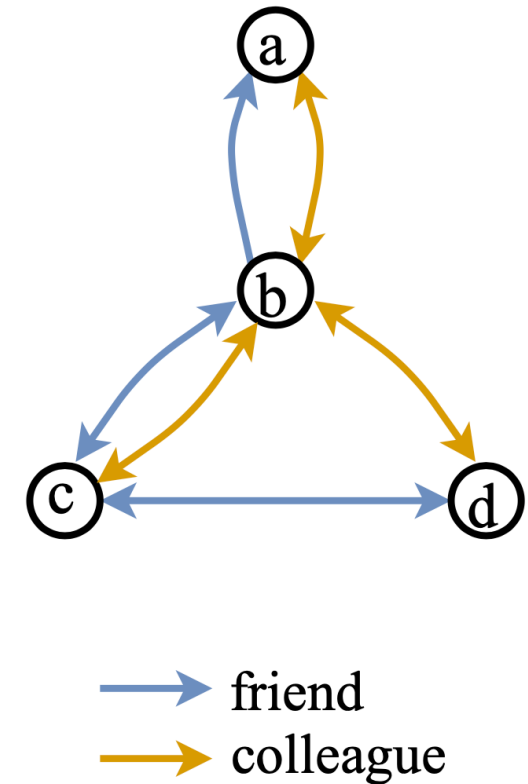
$$\phi := \top \mid \{c\} \mid s \mid \phi \wedge \phi \mid \phi \vee \phi \mid \neg\phi \mid \forall E. \phi \mid \geq_n E. \phi$$
$$\mid eq(E, p) \mid disj(E, p) \mid closed(Q)$$
$$E := p \mid p^- \mid E \cup E \mid E/E \mid E^* \mid E?$$

where  $c \in N, p \in P, s \in S$  and  $Q \subseteq P$

$E$  are regular path queries with inverse and zero-or-one paths

# Example shapes

- “Through a path of **friend** edges, the node can reach node d”
  - $\phi \equiv \geq_1 \text{friend}^*.\{d\}$
  - b, c, and d satisfy  $\phi$  in  $G$
- “Nodes where **friendship** is mutual”
  - $\phi \equiv \text{eq}(\text{friend}, \text{friend}^-)$
  - c and d satisfy  $\phi$  in  $G$
- “Nodes who have at least one **colleague** who is also a **friend**”
  - $\phi \equiv \neg \text{disj}(\text{friend}, \text{colleague})$
  - b and c satisfy  $\phi$  in  $G$



# Shape schemas

The main task is to check whether a **graph** conforms to some constraints, not single nodes.

A shape definition is a statement of the form:  $s \leftarrow \phi$

A shape schema consists of shape definitions and inclusion statements

$$\phi_t \subseteq \phi_s$$

SHACL allows only the following target shapes  $\phi_t$  :

- Node targets:  $\{c\}$
- Class-based targets:  $\geq_1 \text{ subclassOf}^*. \geq_1 \text{ type. } \{c\}$
- Objects-of targets:  $\geq_1 p^- . \top$
- Subjects-of targets:  $\geq_1 p . \top$



We show that real SHACL can be translated to our formalism

# Provenance & Neighborhoods

- Our goal: Provide **provenance** of a shape schema
  - explains **why** the graph conforms
- Provide a **subgraph** of the data that is relevant

Neighborhood:  $B(G, v, \phi)$

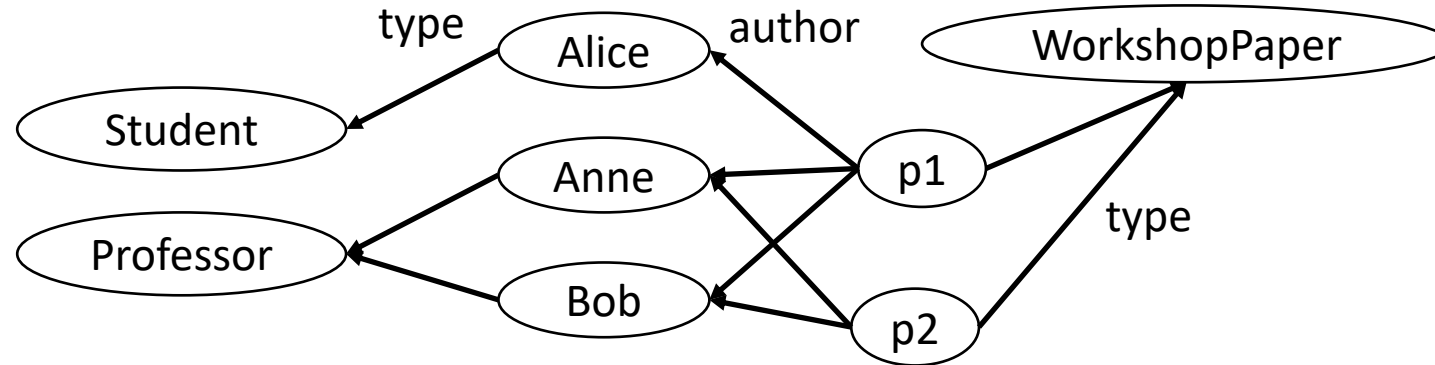
- $G$  a graph
- $v$  a node
- $\phi$  a shape

What part of  $G$  is relevant to decide that  $v$  satisfies  $\phi$  in  $G$ ?



Defining the neighborhood is the core contribution of this work

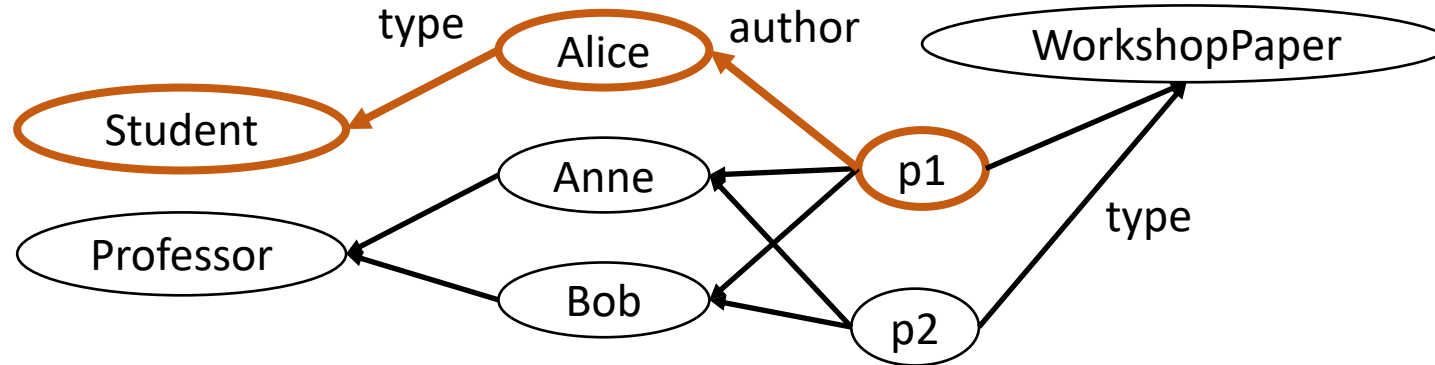
# Neighborhood example



$\text{Workshopshape} \leftarrow \geq_1 \text{author.} \geq_1 \text{type.}\{\text{Student}\}$

$B(G, p1, \text{Workshopshape})$

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$\text{Workshopshape} \leftarrow \geq_1 \text{author.} \geq_1 \text{type.}\{\text{Student}\}$

$B(G, p1, \text{Workshopshape})$



# Shape Fragments

... as an application of neighborhoods.

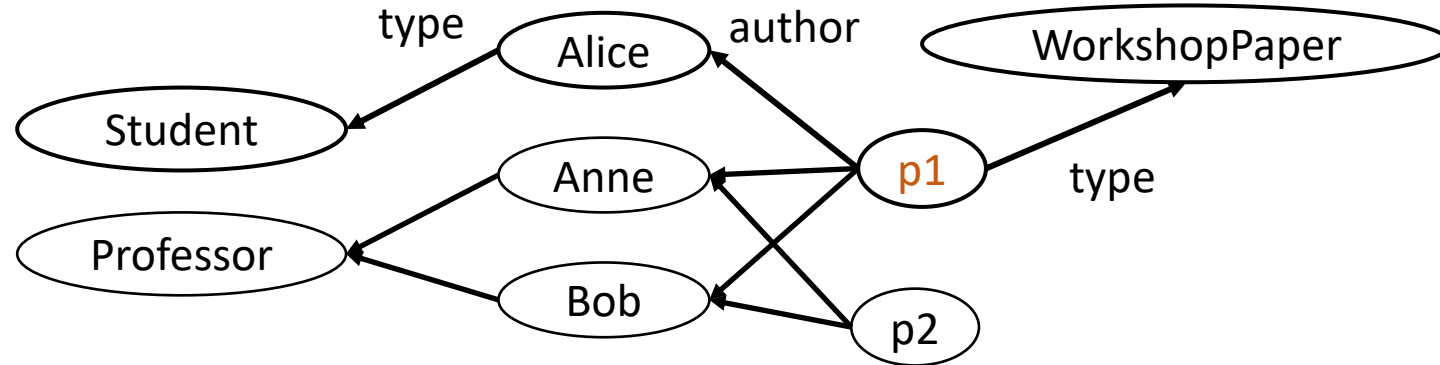
We define  $\mathbf{Frag}(G, S)$  as the union of all neighborhoods of nodes satisfying the shapes from  $S$  in  $G$ .

Let  $H$  be a shape schema, we define:

$$\mathbf{Frag}(G, H) := \mathbf{Frag}(G, S)$$

where  $S = \{\phi \wedge \tau \mid \tau \text{ is the target of } \phi \text{ in } H\}$

# Shape Fragment example

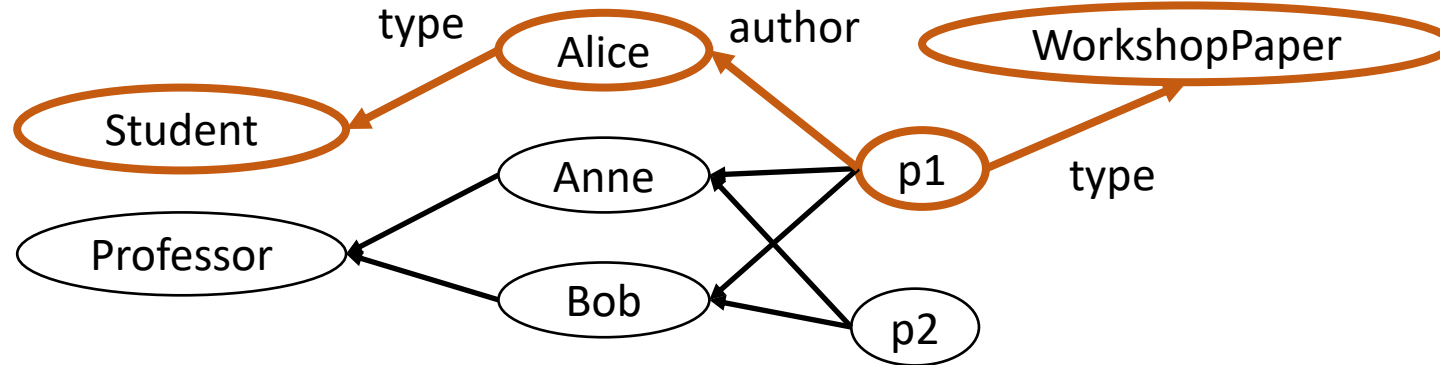


Let  $H$  be the schema:

**Workshopshape**  $\leftarrow \geq_1 \text{author.} \geq_1 \text{type.}\{\text{Student}\}$

$\geq_1 \text{type.}\{\text{WorkshopPaper}\} \subseteq \text{Workshopshape}$

# Shape Fragment example



Let  $H$  be the schema:

$$\text{Workshopshape} \leftarrow \geq_1 \text{author.} \geq_1 \text{type.}\{\text{Student}\}$$
$$\geq_1 \text{type.}\{\text{WorkshopPaper}\} \subseteq \text{Workshopshape}$$

$\text{Frag}(G, H)$

# Correctness properties

We have established:

**Sufficiency Theorem.** If a node  $v$  satisfies a shape  $\phi$  in a graph  $G$ , then:  
 $v$  also satisfies  $\phi$  in  $G'$  for any subgraph  $G' \subseteq G$  s.t.  $B(G, v, \phi) \subseteq G'$ .

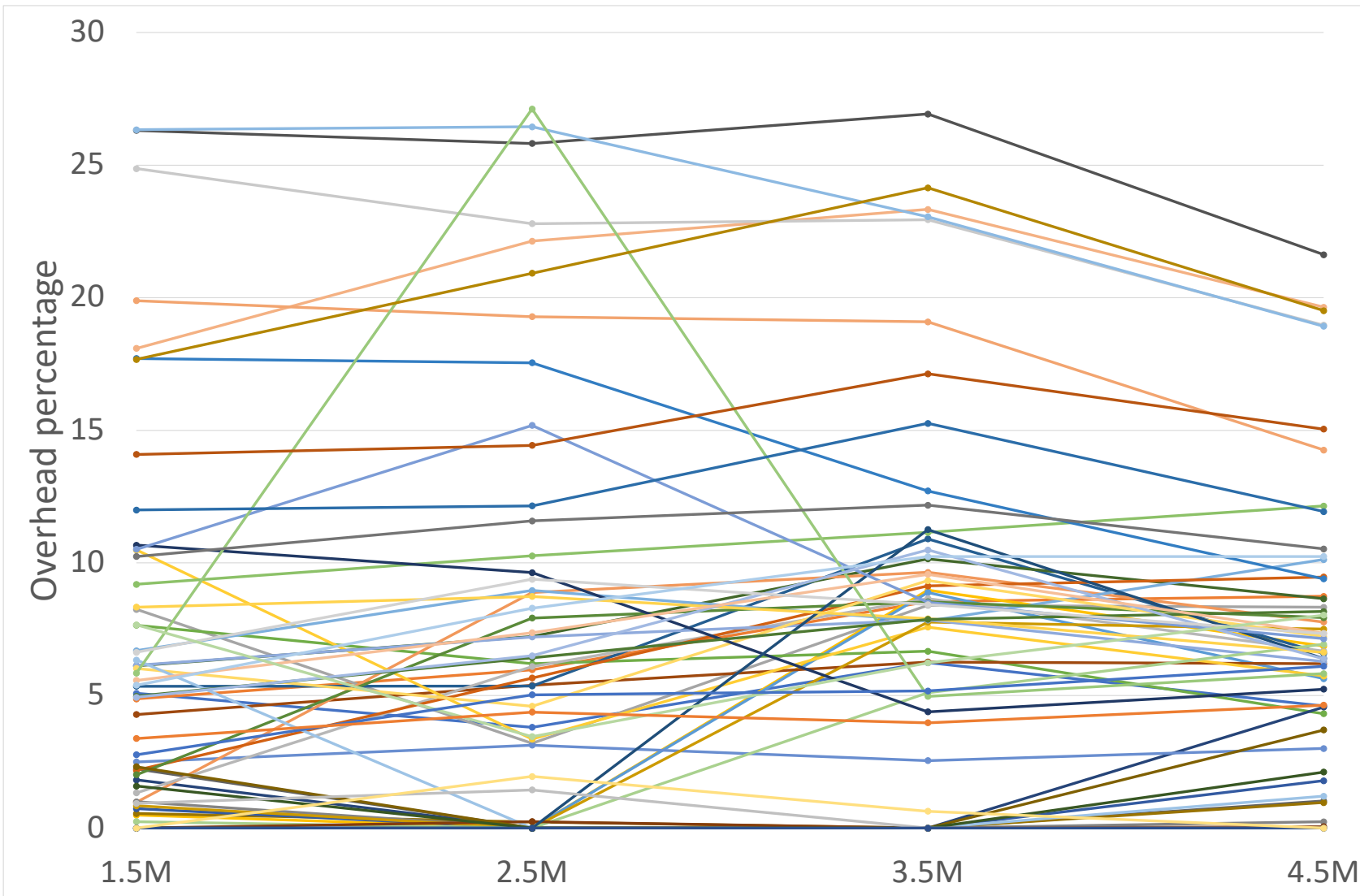
**Conformance Theorem.** If a graph  $G$  satisfies a schema  $H$ , then:  
 $\text{Frag}(G, H)$  also conforms to  $H$ .

# Tools

- PySHACL implementation
- Translation to SPARQL
  - Conformance queries
  - Neighborhood queries

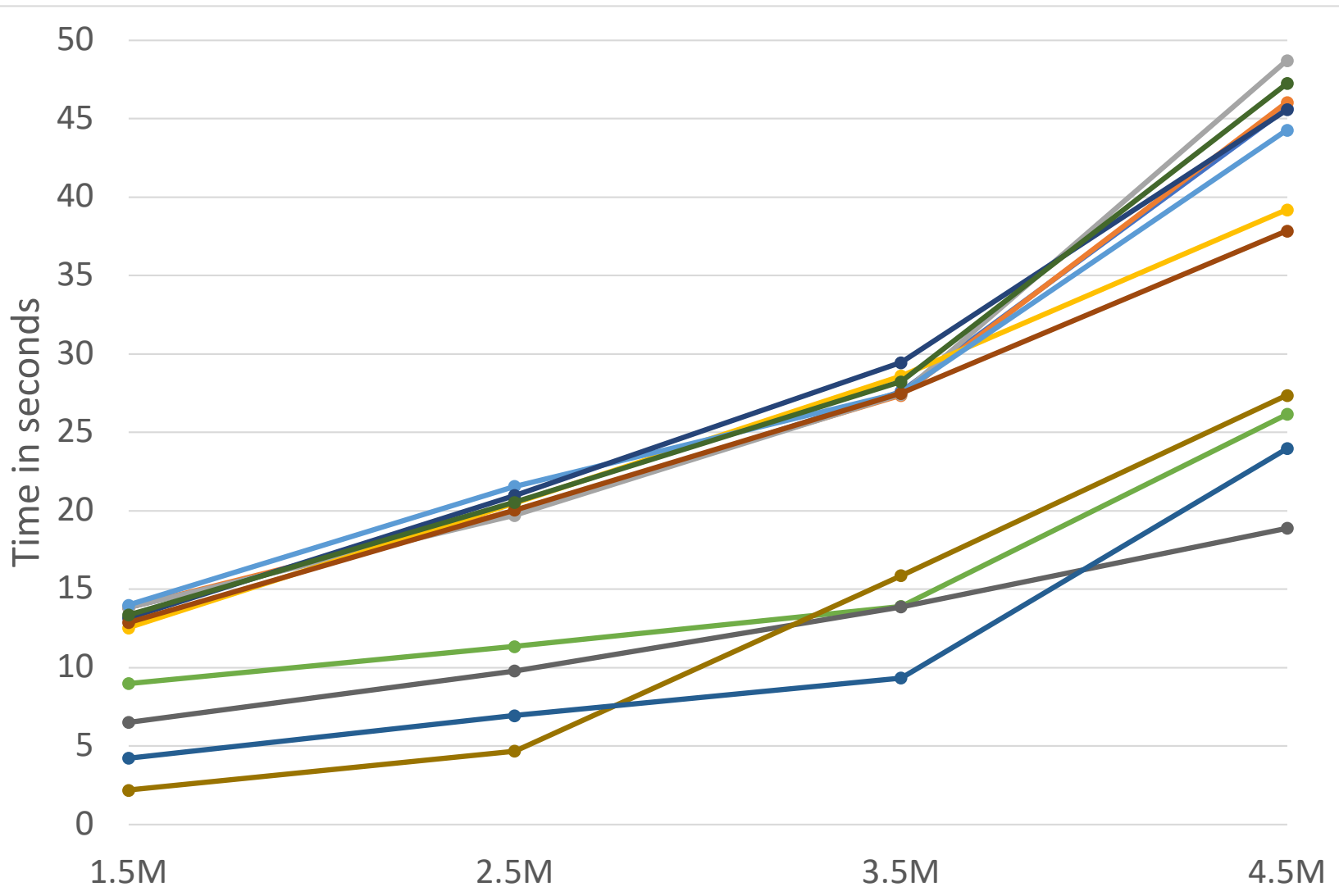


# PySHACL overhead



- 56 shapes
- 1.5 → 4.5M triples
  
- Average: 10%
- Average  $\geq$  1s: 15,6%

# SPARQL query run time



- 13 shapes
- 1.5 → 4.5M triples

# Paths

SHACL supports (regular) path expressions:

$$E ::= p \mid p^- \mid E \cup E \mid E/E \mid E^* \mid E?$$

The neighborhood collects all triples on a path.

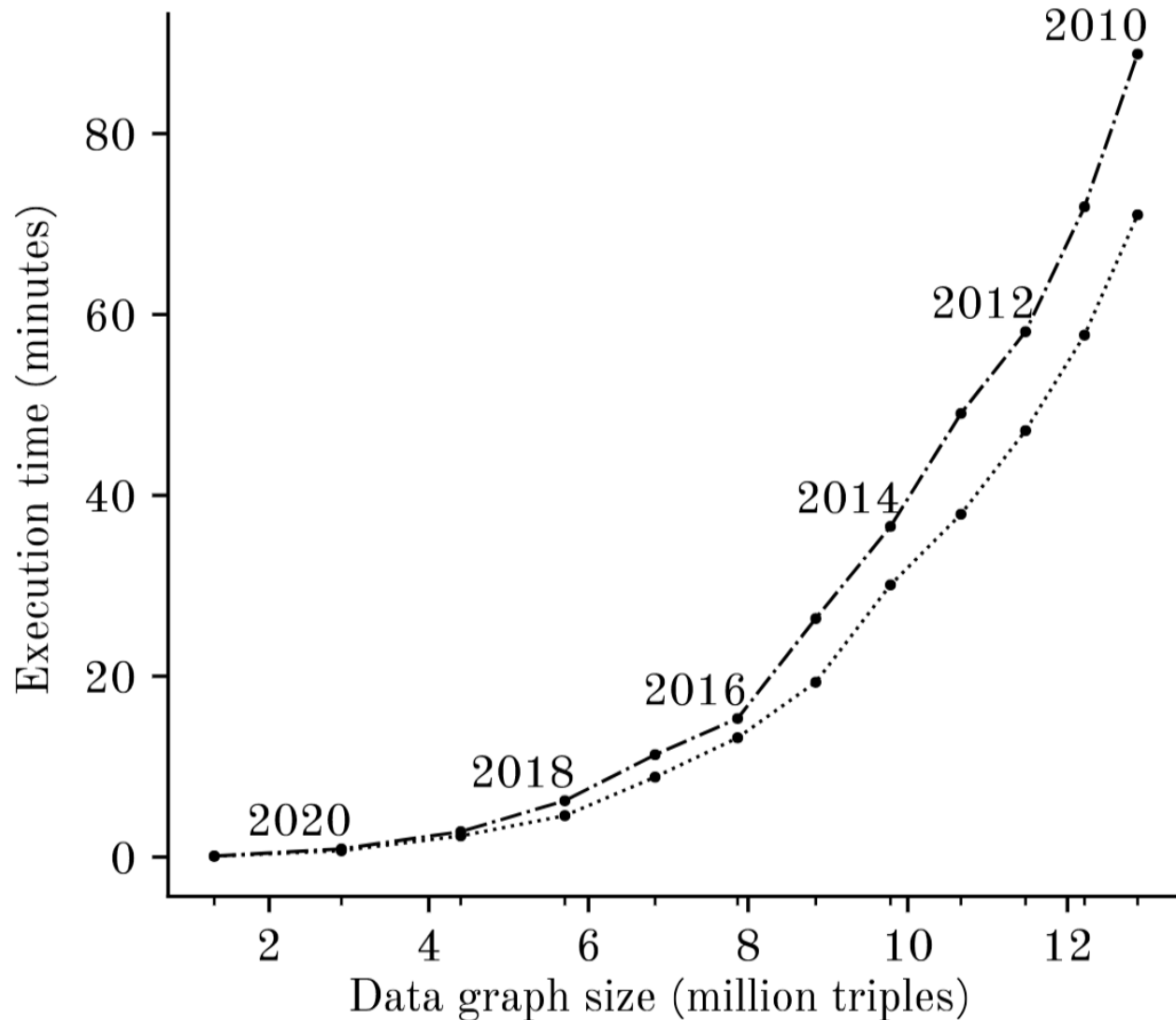
Example:

$$\geq_1 a^-/a/a^-/a/a^-/a.\{MYV\}$$

→ retrieves all authors of distance 3 from {MYV}, **and** all triples on that path.



# Path shape with SPARQL



- Executed on DBLP RDF data
- Run on two SPARQL engines:
  - Jena ARQ (dotted)
  - GraphDB (dashed)

# Conclusion & Open Problems (1)

- There are many different ‘reasonable’ ways to define subgraphs from a shape
- Different definitions have different properties
- Sufficiency is a well-known property
- What properties can a subgraph have?
  - ... e.g., can we define subgraphs that are minimally sufficient and unique?

# Conclusion & Open Problems (2)

- Optimizing generated SPARQL queries
  - Conformance checking
  - Neighborhood extraction