

Study of New Semantics for Regular Path Queries

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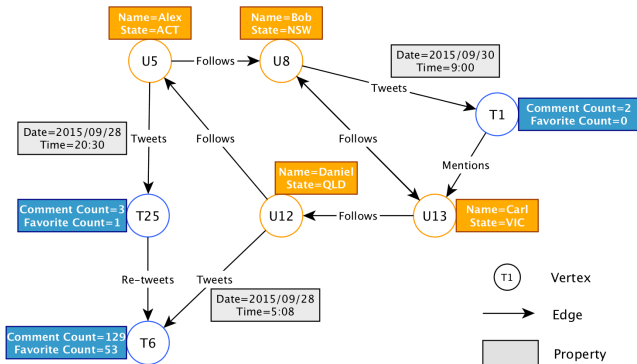


¹Supervised by Amélie Gheerbrant, Victor Marsault and Antoine Meyer.

Introduction

Graph Database

In practice, we have property graphs.

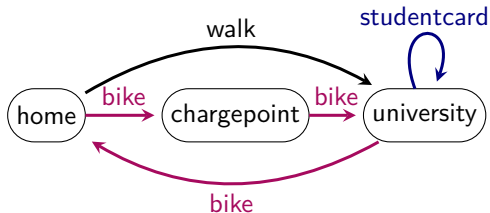


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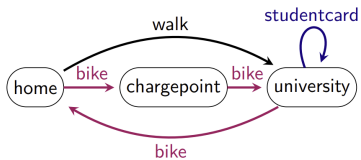
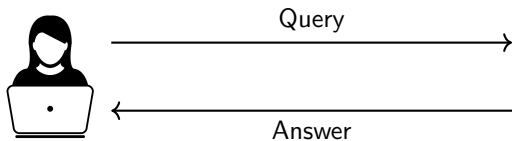
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Our abstraction

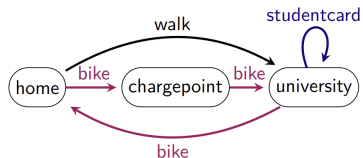
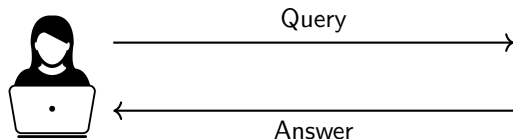
Directed, multi-labeled, multi-edge graph.



Regular Path Queries



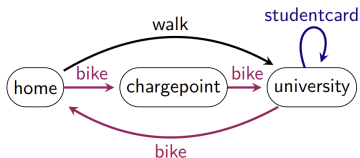
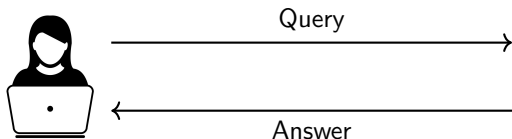
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Regular Path Query

Represented by a regular expression R or an automaton A .

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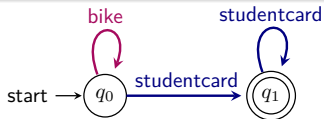


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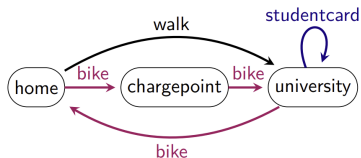
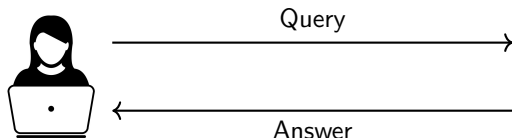
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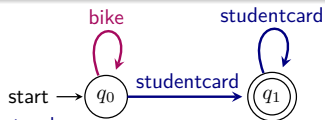
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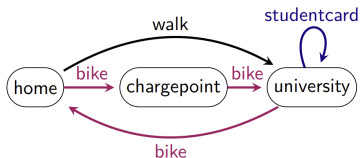
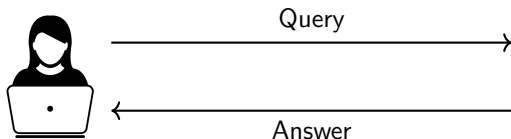
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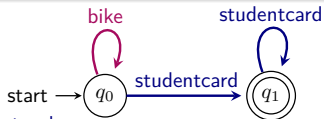
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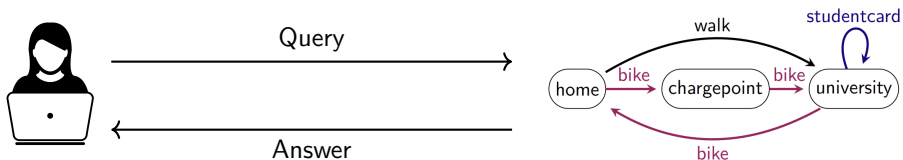
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Walk

Alternating sequence of vertices and edges.



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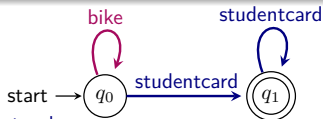
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$\text{MATCH}_A(D)$



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$D \times A$

Product of the graph database D and the automaton A representing the RPQ.

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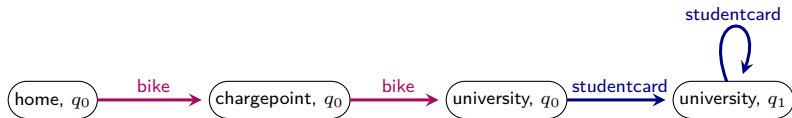
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Figure: Part of the Product Graph

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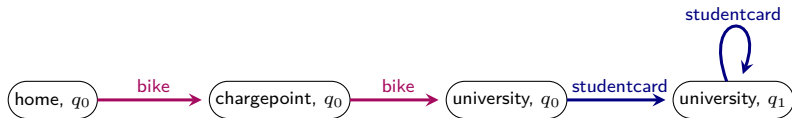
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Figure: Part of the Product Graph

- **Run:** walk in the product graph $D \times A$.

$$(\text{home}, q_0) \xrightarrow{\text{bike}} (\text{chargepoint}, q_0) \xrightarrow{\text{bike}} (\text{university}, q_0) \xrightarrow{\text{studentcard}} (\text{university}, q_1)$$

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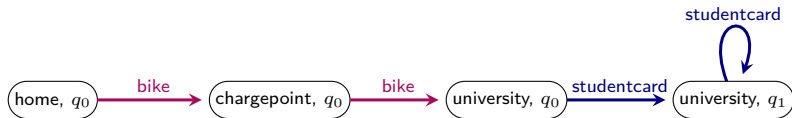
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- **Projection:** A walk $\in \text{MATCH}_{\mathcal{A}}(D)$.

$$\text{home} \xrightarrow{\text{bike}} \text{chargepoint} \xrightarrow{\text{bike}} \text{university} \xrightarrow{\text{studentcard}} \text{university}$$

Matches

Query: From home to university

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The bag of matches.

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Issue? Infinite matches!

RPQ Semantics

Compute a **finite** and **meaningful** output from the matches.

Output of a semantics X : $\llbracket \mathcal{A} \rrbracket_X(D)$

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Criteria

- **Coverage**: Not defined in literature.
- **Computational Properties**: Complexity of the most common computational problems in database querying.

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We need new candidates.

New RPQ Semantics

Shortest-coverage Semantics

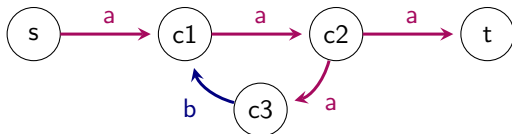
Output

$$\llbracket \mathcal{A} \rrbracket_{SC}(D) = \bigcup_{(s,t,v) \in V^3} \{w \in \text{MATCH}_{\mathcal{A}}(D, s, t) \mid w \text{ is a shortest walk covering } v \text{ in } \text{MATCH}_{\mathcal{A}}(D, s, t)\}$$

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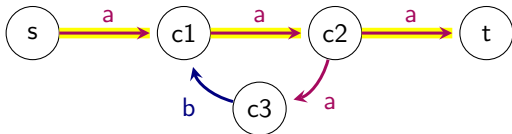
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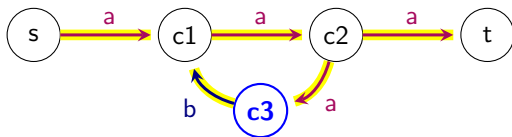
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- For s, c1, c2, t: $s \xrightarrow{a} c1 \xrightarrow{a} c2 \xrightarrow{a} t$

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- **For c3:** $s \xrightarrow{a} c1 \xrightarrow{a} c2 \xrightarrow{a} c3 \xrightarrow{b} c1 \xrightarrow{a} c2 \xrightarrow{a} t$

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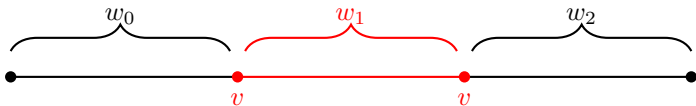
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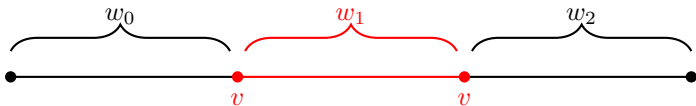
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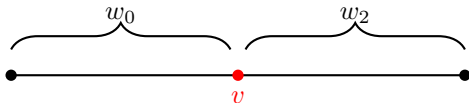
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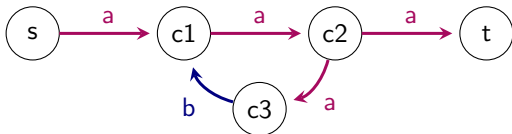
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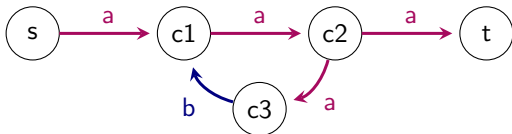
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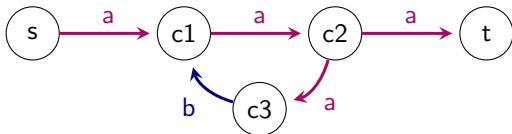
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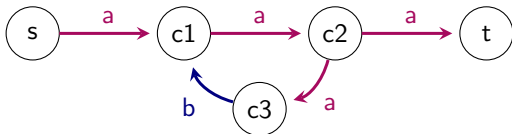
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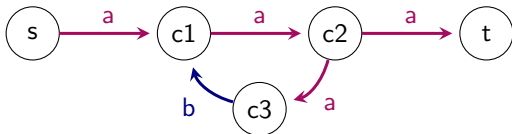
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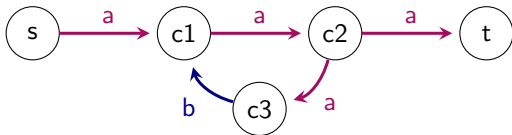
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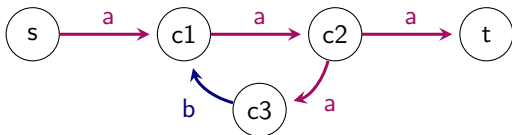
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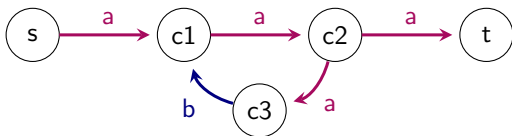
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It is a minimal walk.

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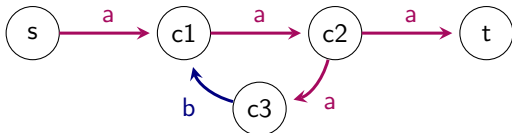
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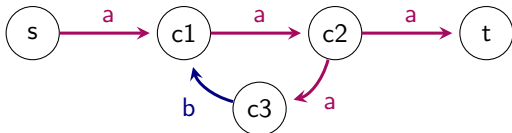
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It is a minimal walk. **No subwalks in the matches!**

$w': s \xrightarrow{a} c1 \xrightarrow{a} c2 \xrightarrow{a} t$ **Not a match!**

Computational Problems: Walk Membership

Problem definition

WALK MEMBERSHIP UNDER X SEMANTICS

Input: A graph database D , a query \mathcal{A} , a walk $w \in \text{MATCH}_{\mathcal{A}}(D)$.

Output: $w \in \llbracket \mathcal{A} \rrbracket_X(D)$?

Walk Membership under shortest-coverage semantics

Theorem

WALK MEMBERSHIP *under shortest-coverage semantics* is in **P**.

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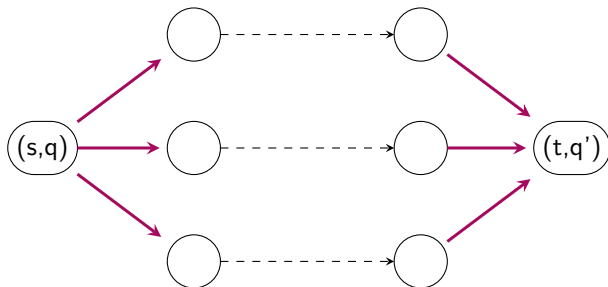
Proof. We work on the product graph.

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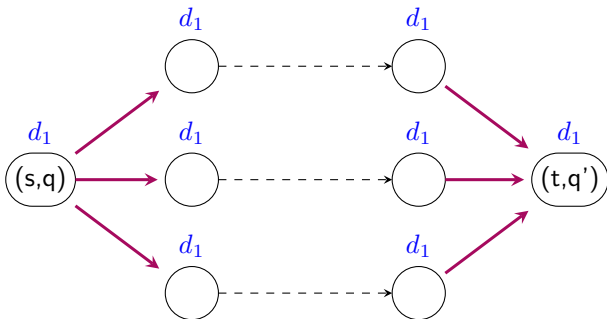
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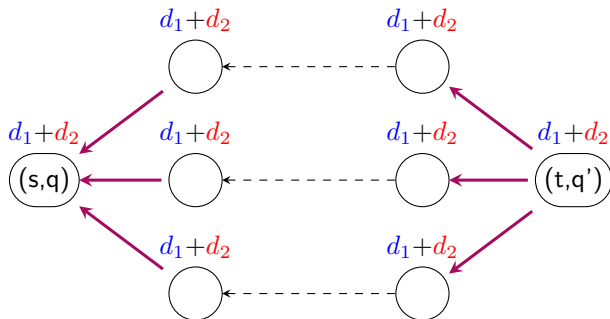
- 1 BFS on $D \times \mathcal{A}$ from sources to each vertex. Distances d_1

Walk Membership under shortest-coverage semantics

Theorem

WALK MEMBERSHIP *under shortest-coverage semantics* is in **P**.

Proof.



- 1 BFS on $D \times \mathcal{A}$ from sources to each vertex. Distances d_1
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- ③ $\exists v$ a vertex in w such that $\forall q \in Q, (d_1 + d_2)((v, q)) \geq |w|? \quad w \in \llbracket \mathcal{A} \rrbracket_{SC}(D)$

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Walk Membership under minimal-walk semantics

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- $Q = \{i \mid 0 \leq i \leq |w| + 1\}$, $I = \{0\}$, $F = \{|w| + 1\}$.

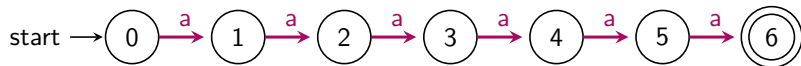
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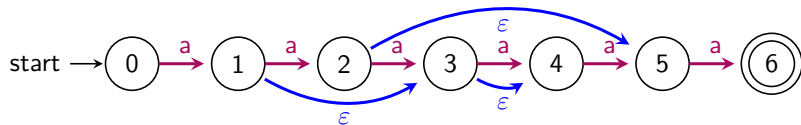
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 $\cup \{(i, \varepsilon, j) \mid n_i = n_j, 0 \leq i < j \leq |w| + 1, \nexists l \in]i, j[, n_l = n_i\}$.

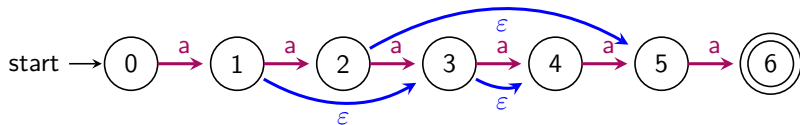
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$D_{\sqsubseteq w}$ has a size in $O(|w|)$ and can be constructed in $O(|w| \log |w|)$.

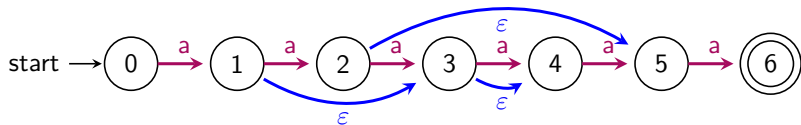
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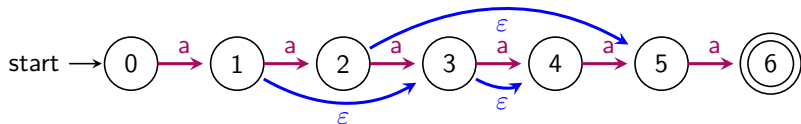
$\mathcal{L}(D_{\sqsubseteq w}) = \{\text{LBL}(w') \mid w' \sqsubseteq w\}$.

Walk Membership under minimal-walk semantics

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- Using a BFS on $D_{\sqsubseteq w} \times \mathcal{A}$, we check if $|w| = |\text{shortestwalk}|$
 $w \in \llbracket \mathcal{A} \rrbracket_{MW}(D)$
 Otherwise, w is not a minimal walk. $w \notin \llbracket \mathcal{A} \rrbracket_{MW}(D)$

Computational Problems: Walk Enumeration

Problem definition

WALK ENUMERATION UNDER X SEMANTICS

Input: A graph database D , a query \mathcal{A} , (s, t) .

Output: $\{\{w \in \llbracket \mathcal{A} \rrbracket_X(D) \mid \text{ENDPOINTS}(w) = (s, t)\}\}$.

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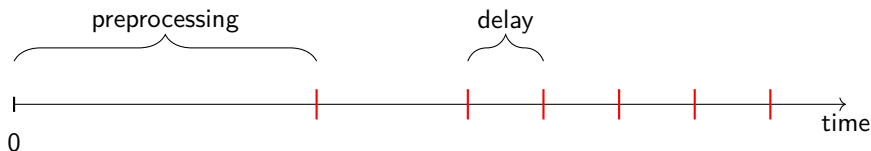
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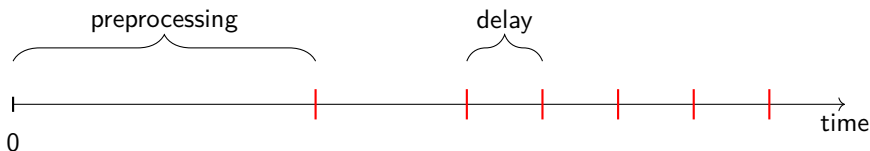
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Definition

A problem A is in $DelayP$ if there is a polynomial p and an algorithm which solves A on input x with a polynomial preprocessing and a delay in $O(p(|x|))$.

Walk Enumeration under shortest-coverage semantics

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 - Get the runs.
 - Output the walks.

Another Enumeration Problem

DISTINCT WALK ENUMERATION UNDER X SEMANTICS

Input: A graph database D , a query \mathcal{A} , (s, t) .

Output: $\{w \in \llbracket \mathcal{A} \rrbracket_X(D) \mid \text{ENDPOINTS}(w) = (s, t)\}$.

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A general approach: DFS on the graph database.

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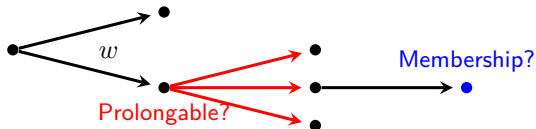
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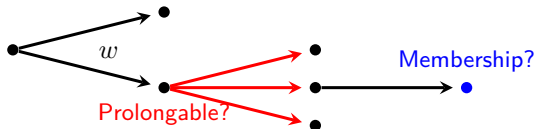


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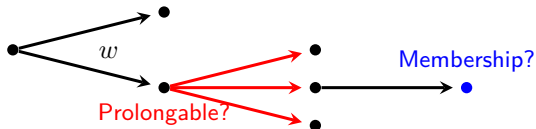
If $\text{PROLONGABILITY} \in \mathbf{P}$ and $\text{WALK MEMBERSHIP} \in \mathbf{P}$, then $\text{DISTINCT WALK ENUMERATION} \in \mathbf{DelayP}$.

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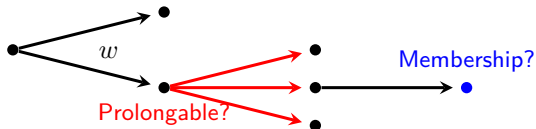
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Open problem:

Is (DISTINCT) WALK ENUM. under minimal-walk semantics in **DelayP**?

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Proof. Reduction from TWO-DISJOINT-PATHS.

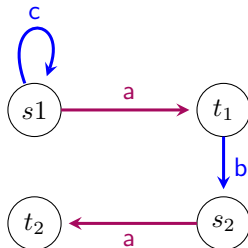
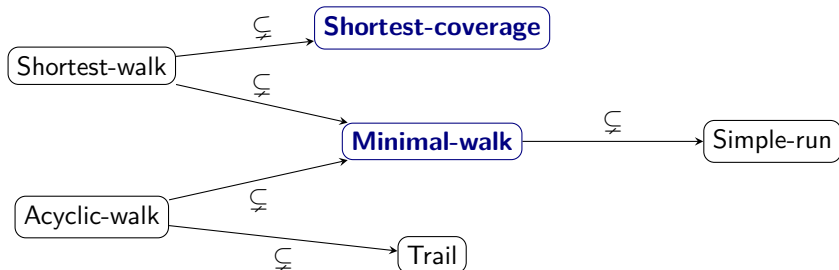


Figure: Reduction with the query $(c \cdot a^* \cdot b \cdot a^*) + a^*$

Conclusion

Summary:

	Shortest-coverage	Minimal-walk
Coverage	Vertex coverage	Subwalk coverage
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- Static analysis of the semantics: CONTAINMENT, EQUIVALENCE.
- Applications to query languages: Cypher, GQL.

Thank you!