# Evaluation and Enumeration Problems for Regular Path Queries 

Wim Martens and Tina Trautner<br>University of Bayreuth

## Practice

## QUERYING PATHS IN GRAPH DATABASES

## Graph Database



Node- and Edge-labeled directed graph

## Warm Up Question



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[SPARQL 2018]: ..... 1
[SPARQL 2012]: ..... 3
[Cypher]: ..... 5

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## The Point

There are different ways of matching paths in graphs
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and any of them can make sense

## But which variant do you want to use in a system?

## Theory

ON QUERYING PATHS IN GRAPH DATABASES

## Computational Problems

Input

Regular expression $\boldsymbol{r}$
called regular path query (RPQ)


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Problem

Path existence
Is there a path from $\bullet$ to $\bullet$ that matches $\boldsymbol{r}$ ?

## Computational Problems

Input

Regular expression $\boldsymbol{r}$
called regular path query (RPQ)


Problem

## Path counting

How many paths from $\bullet$ to $\bullet$ match $\boldsymbol{r}$ ?

## Computational Problems

Input

Regular expression $\boldsymbol{r}$
called regular path query (RPQ)


Problem

## Path enumeration

Enumerate the paths from $\bullet$ to that match $\boldsymbol{r}$

# Considering Different Paths 

Arbitrary paths
Boolean paths
Paths without node repetitions
Paths without edge repetitions

# Considering Different Paths 

Arbitrary paths<br>Boolean paths<br>Paths without node repetitions<br>Paths without edge repetitions

# Considering Different Paths 

## Arbitrary paths

Paths without node repetitions

# Considering Different Paths 

Arbitrary paths

Simple paths

## Complexity of RPQ Evaluation

|  | Existence | Counting | Enumeration |
| :---: | :---: | :---: | :---: |
| Arbitrary paths |  |  |  |
| Simple paths |  |  |  |


| in P | in FP | polynomial delay |
| :---: | :---: | :---: |
| NP-hard | \#P-hard | too much delay |

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| :---: | :---: | :---: | :---: |
| Arbitrary paths | $\boldsymbol{\jmath}$ | $\mathbf{x}$ | $\boldsymbol{V}$ |
| Simple paths | $\mathbf{x}$ | $\mathbf{x}$ | $\mathbf{x}$ |


| "user happy": | in P | in FP | polynomial delay |
| :---: | :---: | :---: | :---: |
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## Complexity of RPQ Evaluation


similar to
counting words in language of regular expression
\#P-complete [Kannan et al., SODA 1995]

## Complexity of RPQ Evaluation

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| Arbitrary paths | $\boldsymbol{V}$ | $\boldsymbol{X}$ | $\boldsymbol{V}$ |
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Is there a simple path matching $a^{*} b a^{*}$ ?
NP-complete [Mendelzon, Wood, SICOMP 1995]
essentially because „simple path via a node" is NP-hard [Fortune et al., TCS 1980]

Is there a simple path matching (aa)*?
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Is there a simple path matching (aa)*?
NP-complete [Lapaugh, Papadimitriou, Networks 1984]
[Bagan, Bonifati, Groz PODS 2013]
Dichotomy for which expressions the data complexity of this problem is in P or NP-complete

## Theory VS Systems

Theory:

Systems:

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Theory: „Simple paths are computationally difficult, even for very small RPQs"

## Systems:

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Theory: „Simple paths are computationally difficult, even for very small RPQs"

Systems: „But we use simple paths and we're fine"

## What is going on with these <br> simple paths?

## RPQs in SPARQL Query Logs

[Bonifati, M., Timm, PVLDB 2017]

Extracted 247,404 RPQs from SPARQL query logs (2009-2017)
(from DBPedia, biological databases, British museum, Wikidata, ...)

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$\square$ Only very few different kinds of RPQs
$( \pm 17)$

## RPQs in SPARQL Query Logs

| Expression Type | Relative | Expression Type | Relative |  |
| :---: | :---: | :---: | :---: | :---: |
| $A^{*}$ | 48.76\% | $a^{*} b$ ? | <0.01\% | $k \leq 6$ |
| A | 32.10\% | $a b c^{*}$ | <0.01\% |  |
| $a_{1} \cdots a_{k}$ | 8.66\% | $A_{1} \cdots A_{k}$ | <0.01\% | Disjunction of symbols:$A, A_{1}, \ldots$ |
| $a^{*} b$ | 7.73\% | $\left(a b^{*}\right)+c$ | <0.01\% |  |
| $A^{+}$ | 1.54\% | $a^{*}+b$ | <0.01\% |  |
| $a_{1} ? \cdots a_{k}$ ? | 1.15\% | $a+b^{+}$ | <0.01\% | Single symbols: <br> $a, b, c, a_{1}, \ldots$ |
| $a A$ ? | 0.01\% | $a^{+}+b^{+}$ | <0.01\% |  |
| $a_{1} a_{2} ? \cdots a_{k}$ ? | 0.01\% | $(a b)^{*}$ | <0.01\% |  |
| $A$ ? | <0.01\% |  |  |  |

Data from [Bonifati et al., PVLDB 2017]

## Simple Transitive Expressions

## Atomic Expression

disjunction $\left(a_{1}+\cdots+a_{n}\right)$ of symbols
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| Local Expression |  |  |
| :---: | :---: | :---: |
| $A_{1} \cdots A_{\boldsymbol{k}}$ | or | $A_{1} ? \cdots A_{\boldsymbol{k}}$ ? |
| "follow a path of length $\mathrm{k}^{\prime \prime}$ | "follow a path of length at most k " |  |

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"follow a path of length $k$ " "follow a path of length at most $k$ "

Simple Transitive Expression (STE)
$L_{1} A^{*} L_{2} \quad$ where $L_{1}, L_{2}$ are local expressions

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$k \leq 6$ STE

Union of STEs
something else

Data from [Bonifati et al., PVLDB 2017]

## RPQs in SPARQL Query Logs



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## Main Theorem Warm-Up

## Simple path existence

Given graph $\boldsymbol{G}$, nodes $\boldsymbol{s}$ and $\boldsymbol{t}$, and RPQ $\boldsymbol{r}$, is there a simple path from $\boldsymbol{s}$ to $\boldsymbol{t}$ that matches $\boldsymbol{r}$ ?

## Main Theorem Warm-Up

```
Simple path existence for R
Given graph G, nodes \boldsymbol{s}\mathrm{ and }\boldsymbol{t}\mathrm{ , and RPQ r }\in\boldsymbol{R},
    is there a simple path from }\boldsymbol{s}\mathrm{ to }\boldsymbol{t}\mathrm{ that matches }\boldsymbol{r}\mathrm{ ?
```

Example classes $\boldsymbol{R}$ :

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for $\boldsymbol{k} \in \mathbb{N}$
denote this by $\left\{\boldsymbol{a}^{\boldsymbol{k}} \mid \boldsymbol{k} \in \mathbb{N}\right\}$

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These are non-trivial problems!

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Theorem [Alon, Yuster, Zwick, JACM 1995]
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Color coding technique

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## Main Theorem

Let $\boldsymbol{R}$ be a class ${ }^{(*)}$ of STEs:
if $\boldsymbol{R}$ is cuttable, then simple path existence for $\boldsymbol{R}$ is in FPT otherwise, simple path existence for $\boldsymbol{R}$ is W[1]-hard.
${ }^{(*)}$ satisfying a mild condition, needed for W[1] hardness

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parameter: size of RPQ

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## Intuition behind Cuttability



Path that matches $\boldsymbol{r}$

## Intuition behind Cuttability



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Simple Path that matches $\boldsymbol{r}$ ?
Does the simple path still match $\boldsymbol{r}$ ?

- "Easy" to check for aaaaa*
- "Hard" to check for bbbba*
(check length)
(check length+label)


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Simple Path that matches $\boldsymbol{r}$ ?
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- "Hard" to check for $\boldsymbol{b} \boldsymbol{b} \boldsymbol{b} \boldsymbol{b} \boldsymbol{a}^{*}$
(check length)
(check length+label)
cut border for $\boldsymbol{b} \boldsymbol{b} \boldsymbol{b} \boldsymbol{b} \boldsymbol{a}^{*}$


## Formalizing this Idea

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Consider STE $\quad r=A_{1} \cdots A_{\boldsymbol{k}} A^{*}$
Its cut border $\ell$ is the largest number such that $A \nsubseteq A_{\ell}$
(and $\ell=0$ if no such $A_{\ell}$ exists)

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Examples

- aaaa*
- aaba*
$=(\boldsymbol{a}+\boldsymbol{c}) \boldsymbol{a b}(\boldsymbol{a}+\boldsymbol{b})^{*}$

$$
\begin{aligned}
& \ell=0 \\
& \ell=3 \\
& \ell=3
\end{aligned}
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$$
\text { because }\{\boldsymbol{a}\} \nsubseteq\{\boldsymbol{b}\}
$$

${ }^{-}(\boldsymbol{a}+\boldsymbol{c}) \boldsymbol{a b}(\boldsymbol{a}+\boldsymbol{b})^{*}$
because $\{\boldsymbol{a}, \boldsymbol{b}\} \nsubseteq\{\boldsymbol{b}\}$

## Definition

A class $\boldsymbol{R}$ of STEs is cuttable, if there is a constant $c$ such that all its expressions have cut border $\leq c$

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parameter: size of RPQ

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For the FPT upper bound, the complexity in the parameter is single exponential

## Upper Bound Idea

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## Theorem [Alon, Yuster, Zwick, JACM 1995] <br> Finding simple paths of length exactly $k$ is in FPT

Color coding technique

## Theorem [Fomin et al., JACM 2016]

Finding simple cycles of length at least $\mathbf{k}$ is in FPT
Representative sets technique

> Theorem [Technique from Fomin et al., JACM 2016] communicated to us by Holger Dell

Finding simple paths of length at least $k$ is in FPT
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$$
\boldsymbol{s} \overline{A_{1} \cdots A_{c}}
$$

## Brute force

## Upper Bound Idea

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\boldsymbol{s} \overline{A_{1} \cdots A_{c}}
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## Brute force

Simple Path matching $A_{c+1} \cdots \boldsymbol{A}_{\boldsymbol{k}} A^{*}$
and avoiding the brute force part

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Since $A \subseteq A_{i}$

## Lower Bound Idea

## Parameterized Two Disjoint Paths

## Lower Bound Idea

## Parameterized Two Disjoint Paths

Given graph $\boldsymbol{G}$,
nodes $\quad s_{1}$ and $t_{1}$ and $s_{2}$ and $t_{2}$ and a parameter $\mathbf{k}$

Are there node-disjoint paths
from $s_{1}$ to $t_{1}$ from $s_{2}$ to $t_{2}$


## Lower Bound Idea

## Parameterized Two Disjoint Paths

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nodes $\quad s_{1}$ and $t_{1}$ and $s_{2}$ and $t_{2}$ and a parameter $\mathbf{k}$

Are there node-disjoint paths
from $s_{1}$ to $\boldsymbol{t}_{1}$ of length at most $\mathbf{k}$ from $s_{2}$ to $t_{2}$


## Lower Bound Idea

```
Parameterized Two Disjoint Paths
Given graph G,
    nodes }\mp@subsup{s}{1}{}\mathrm{ and t}\mp@subsup{t}{1}{}\mathrm{ and }\mp@subsup{s}{2}{}\mathrm{ and }\mp@subsup{t}{2}{
    and a parameter k
Are there node-disjoint paths
    from }\mp@subsup{\boldsymbol{s}}{\mathbf{1}}{}\mathrm{ to }\mp@subsup{\boldsymbol{t}}{\mathbf{1}}{}\mathrm{ of length at most k
    from }\mp@subsup{s}{2}{}\mathrm{ to t}\mp@subsup{t}{2}{
```


## Theorem (Main Technical Result)

## Parameterized Two Disjoint Paths is W[1]-hard

Building on proofs from [Slivkins, SIDMA 10; Grohe\&Grüber ICALP 07]

## Lower Bound Idea

## Theorem (Main Technical Result) <br> Parameterized Two Disjoint Paths is W[1]-hard

## Lemma

Let $\boldsymbol{R}$ be a class ${ }^{(*)}$ of STEs:
if $\boldsymbol{R}$ is not cuttable, then simple path existence for $\boldsymbol{R}$ is $\mathbf{W}[\mathbf{1}]$-hard.

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Warning: drastic oversimplification

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The main result extends to:

- Enumeration problems

FPT time becomes FPT delay
using [Yen 1971]

- Edge-disjoint paths

But the dichotomy slightly changes
[ArXiv 2017]

# Taking a Step Back 

WHAT DID WE LEARN HERE?

## So what does all this mean?

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| $a_{1} a_{2} ? \cdots a_{k} ?$ | $0.01 \%$ | $(a b)^{*}$ | $<0.01 \%$ |
| $A ?$ | $<0.01 \%$ |  |  |

$$
\mathrm{k} \leq 6
$$

Cuttable STEs
( $\ell \leq 2$ ) Thus in FPT

## Union of STEs

something else

- These expressions have cut border $\leq \mathbf{2}$
- The FPT algorithms have parameter $\boldsymbol{k} \leq \mathbf{6}$
- But even naive algorithms are expected to work reasonably well (brute-force checks for paths of lengh 2 and simple paths of length 6)


## Take Home Messages

- Looking in query logs can pay off and inspire new research questions!
-99.99\% of RPQs found in a practical study are Simple Transitive Expressions (STEs)
- Dichotomy for simple path evaluation of STEs
- Another one for no-repeated-edge semantics is similar
- If "cut borders are bounded", evaluation of STEs is FPT
- Cut borders in the real data are at most 2
- "FPT parameters" in the real data are 6 (for exact length) and 2 (for minimum length)


## Thank you!

