

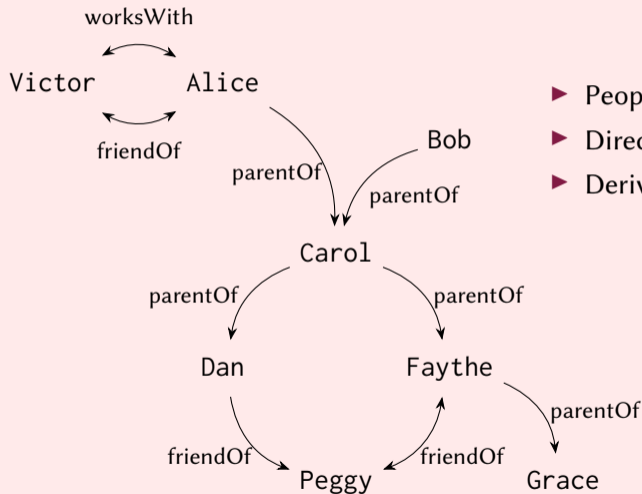
Explaining Results of Path Queries on Graphs: Single-Path Results for Context-Free Path Queries

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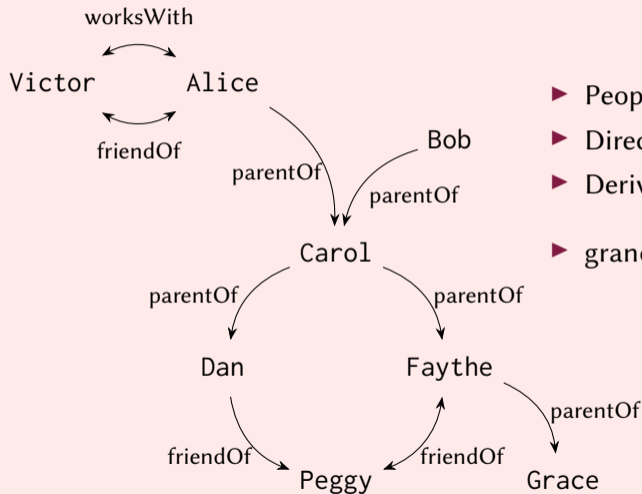


Edge-labeled graphs and queries



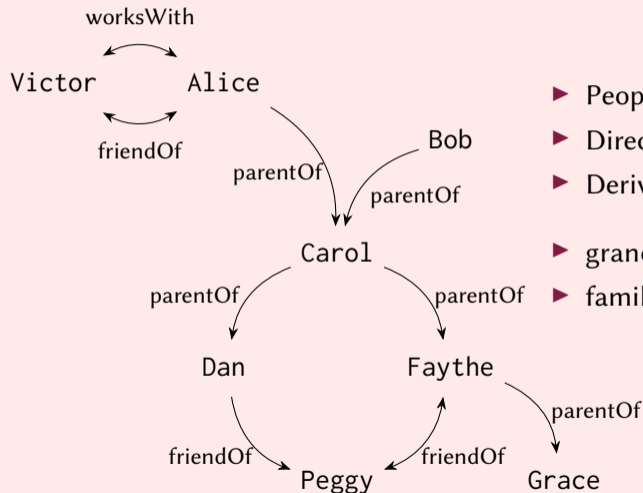
- ▶ People are *nodes*.
- ▶ Direct relationships are *edges*.
- ▶ Derivable relationships are *queries*.

Edge-labeled graphs and queries



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- ▶ $\text{grandParentOf} := \text{parentOf} \circ \text{parentOf}$.

Edge-labeled graphs and queries



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- ▶ Direct relationships are *edges*.
- ▶ Derivable relationships are *queries*.
- ▶ $\text{grandParentOf} := \text{parentOf} \circ \text{parentOf}$.
- ▶ $\text{familyOf} := (\text{parentOf} \cup \text{childOf})^*$.

Path queries: Expressing queries via formal languages

- ▶ Simple queries represent graph navigation via a path.
- ▶ Capture this navigation via the path labeling.
- ▶ Express the labeling of interest via a formal language
E.g., regular languages or context-free languages.

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This work: Context-free path queries

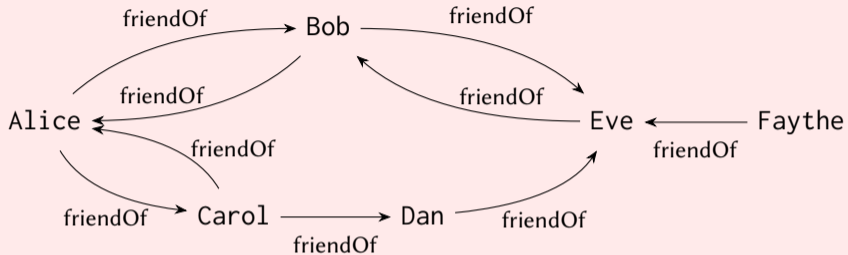
A grammar $\mathcal{G} = (\mathcal{N}, \Sigma, \mathcal{P})$ is

- ▶ a set of non-terminals \mathcal{N} ;
- ▶ a set of alphabet symbols Σ ; and
- ▶ a set of production rules \mathcal{P} of the form $A \mapsto \sigma$ or $A \mapsto B C$.

Example: The context-free grammar for $\text{indirectFriendOf} := \text{friendOf}^+$

$\mathcal{N} = \{A\}$, $\Sigma = \{\text{friendOf}\}$, and $\mathcal{P} = \{A \rightarrow \text{friendOf}, A \rightarrow A A\}$.

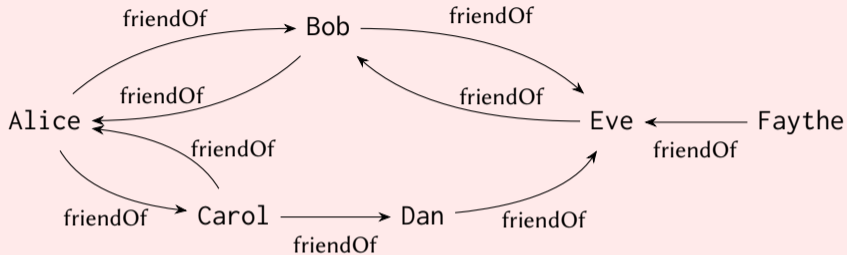
Limitations of traditional path query evaluation



Problem: Alice wants to contact Eve via friends

indirectFriendOf

Limitations of traditional path query evaluation



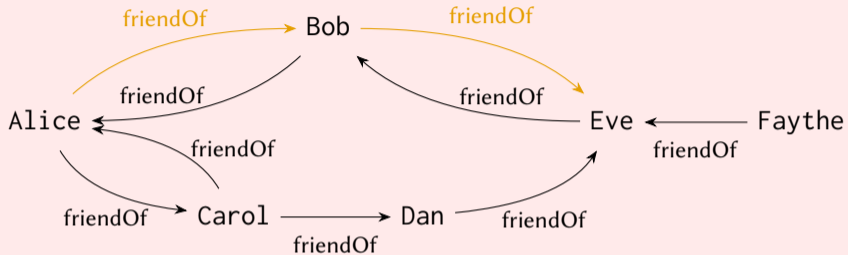
Problem: Alice wants to contact Eve via friends

indirectFriendOf

evaluates to

Alice	Alice
Alice	Carol
...	...
Alice	Eve
...	...

Limitations of traditional path query evaluation



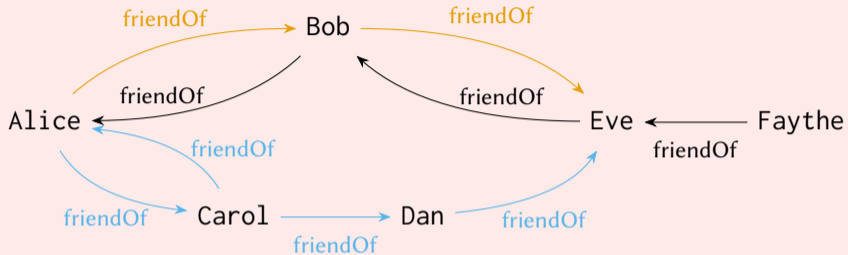
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Limitations of traditional path query evaluation



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`indirectFriendOf`

evaluates to →

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The single-path semantics

The evaluation $\text{single}(q|\mathfrak{G})$ of *path query* q specified by *language* \mathcal{L} on *graph* \mathfrak{G} yields

$$\text{single}(q|\mathfrak{G}) = \{m\pi n \mid \pi \text{ is a shortest path in } \mathfrak{G} \text{ such that } \text{trace}(\pi) \in \mathcal{L}\}.$$

indirectFriendOf

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indirectFriendOf

evaluates to
single-path

```
Alice friendOf Bob friendOf Alice
Alice friendOf Carol
...
Alice friendOf Bob friendOf Eve
...
```

Representing the paths of interest

- ▶ Edge-labeled graphs are *finite automata*.
- ▶ The traces of paths from one node to another represent a *regular language*.

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Lemma (Bar-Hillel et al.)

Let $\mathcal{C} = (\mathcal{N}, \Sigma, \mathcal{P})$ be a grammar, let $\mathfrak{G} = (\mathcal{V}, \Sigma, \delta)$ be a graph, let $A \in \mathcal{N}$, and let $m, n \in \mathcal{V}$.
The language $\mathcal{L}(\mathcal{C}; A) \cap \mathcal{L}(\mathfrak{G}; m, n)$ can be represented by a grammar.

Representing the paths of interest

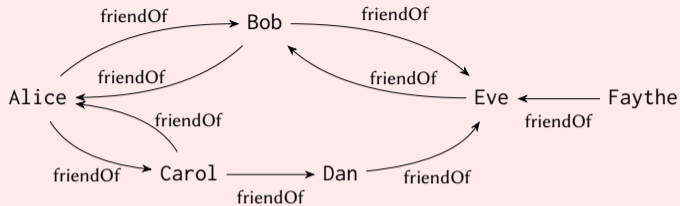
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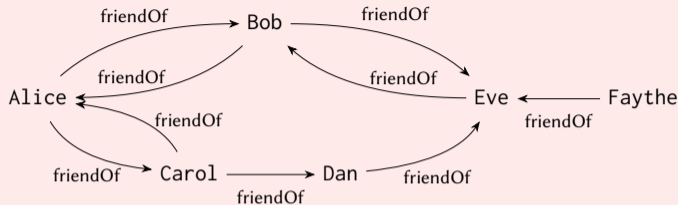
- ▶ Mismatch: many paths have the same trace!
- ▶ Solution: combine encoding of grammar and graph via *annotated grammar*.

Annotated grammar: Example



indirectFriendOf :=
 $\{A \rightarrow \text{friendOf}, A \rightarrow A A\}.$

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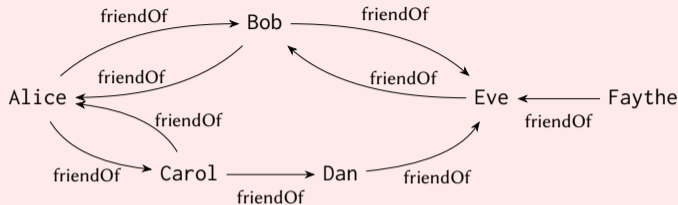


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Annotated grammar $\mathcal{C}|_{\mathfrak{G}} = (\mathcal{N}|_{\mathfrak{G}}, \Sigma, \mathcal{P}|_{\mathfrak{G}})$ with

- ▶ $\mathcal{N}|_{\mathfrak{G}} = \{A|_{mn} \mid m, n \in \{A, B, C, D, E\}\} \cup \{A|_{Fn} \mid n \in \{A, B, C, D, E\}\};$ and
- ▶ $\mathcal{P}|_{\mathfrak{G}} = P_{\Sigma} \cup P_{\mathcal{N}}$ with
 - ▶ $P_{\Sigma} = \{A|_{mn} \mapsto \sigma \mid (m, \sigma, n) \in \delta \wedge (A \mapsto \sigma) \in \mathcal{P}\};$ and
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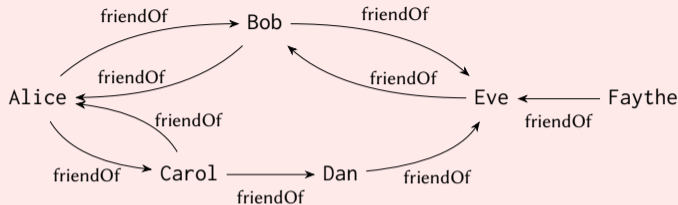
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Deriving a path from Alice to Eve

$A|_{\text{AliceEve}}$

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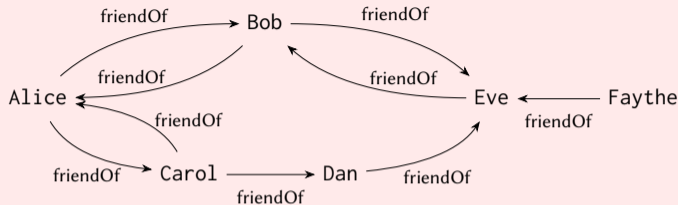
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Deriving a path from Alice to Eve

$A|_{\text{AliceCarol}} A|_{\text{CarolEve}}$

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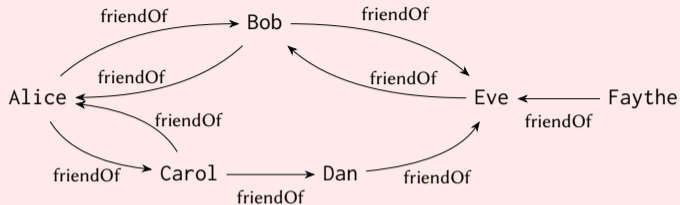
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Deriving a path from Alice to Eve

$A|_{\text{AliceCarol}} A|_{\text{CarolDan}} A|_{\text{DanEve}}$

Annotated grammar: Example



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Deriving a path from Alice to Eve

Alice friendOf Carol friendOf Dan friendOf Eve

Shortest string in a grammar

Algorithm MINIMIZESET($\mathcal{C} = (\mathcal{N}, \Sigma, \mathcal{P})$):

```
1:  $\mathcal{P}'$ ,  $cost :=$  empty mapping, empty mapping.
2:  $new$  is a min-priority queue.
3: for all  $(A \mapsto \sigma) \in \mathcal{P}$  do
4:   if  $A \notin cost$  then
5:      $cost[A]$ ,  $\mathcal{P}'[A] := 1$ ,  $(A \mapsto \sigma)$ .
6:     add  $A$  to  $new$  with priority 1.
7: while  $new \neq \emptyset$  do
8:   Take  $A$  with minimum priority in  $new$ .
9:   Remove  $A$  from  $new$ .
10:  for all  $(C \mapsto A B) \in \mathcal{P}$  with  $B \in cost$  do
11:    PRODUCE( $C \mapsto A B$ ).
12:  for all  $(C \mapsto B A) \in \mathcal{P}$  with  $B \in cost$  do
13:    PRODUCE( $C \mapsto B A$ ).
14: return  $\{\mathcal{P}'[A] \mid A \in \mathcal{P}'\}$ .
```

Algorithm PRODUCE($D \mapsto E F$):

```
1: if  $D \notin cost$  then
2:    $cost[D] := cost[E] + cost[F]$ .
3:    $\mathcal{P}'[D] := D \mapsto E F$ .
4:   Add  $D$  to  $new$  with priority  $cost[E] + cost[F]$ .
5: else if  $cost[D] > cost[E] + cost[F]$  then
6:    $cost[D] := cost[E] + cost[F]$ .
7:    $\mathcal{P}'[D] := D \mapsto E F$ .
8:   Lower priority of  $D \in new$  to  $cost[E] + cost[F]$ .
```

Theorem

MINIMIZESET(\mathcal{C}) yields a *minimizing set of production rules* in

$$O(|\mathcal{N}|(|\mathcal{N}| \log |\mathcal{N}| + |\mathcal{P}|)).$$

Evaluating single-path semantics

$\text{MINIMIZESETGG}(\mathcal{C} = (\mathcal{N}, \Sigma, \mathcal{P}), \mathfrak{G} = (\mathcal{V}, \Sigma, \delta))$

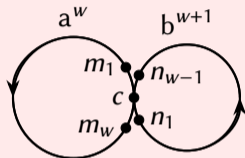
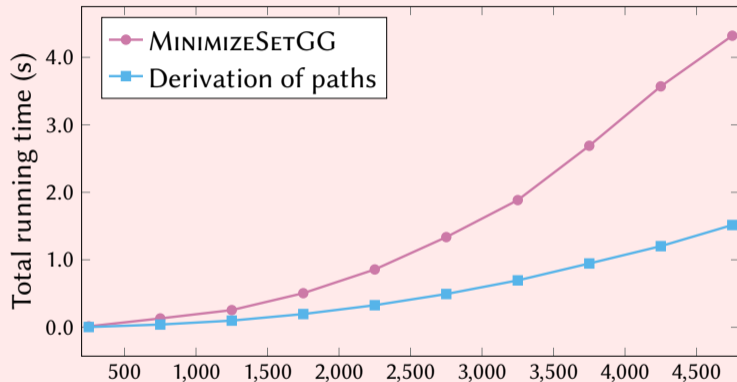
1. Use MINIMIZESET on an annotated grammar.
2. Improvement: derive annotated grammar in-place.
3. Derive shortest paths from the resulting production rules.

Theorem

$\text{MINIMIZESETGG}(\mathcal{C}, \mathfrak{G})$ yields a *minimizing set of production rules* in

$$O(|\mathcal{N}||\mathcal{V}|^2(|\mathcal{N}||\mathcal{V}|^2 \log(|\mathcal{N}||\mathcal{V}|^2) + |\mathcal{P}|(|\mathcal{V}|^3 + |\delta|)).$$

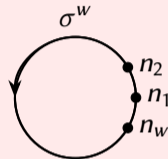
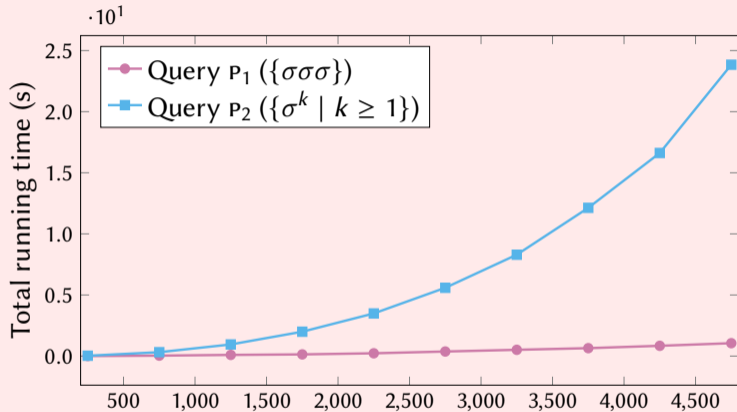
Cost of the single-path semantics



- ▶ 11, 290, 751 paths.
- ▶ Longest: 11, 286, 001 edges.
- ▶ Average: 5.640.627 edges.

$Q \mapsto A Q'$, $Q' \mapsto Q B$, $Q \mapsto A B$,
 $A \mapsto a$, $B \mapsto b$.

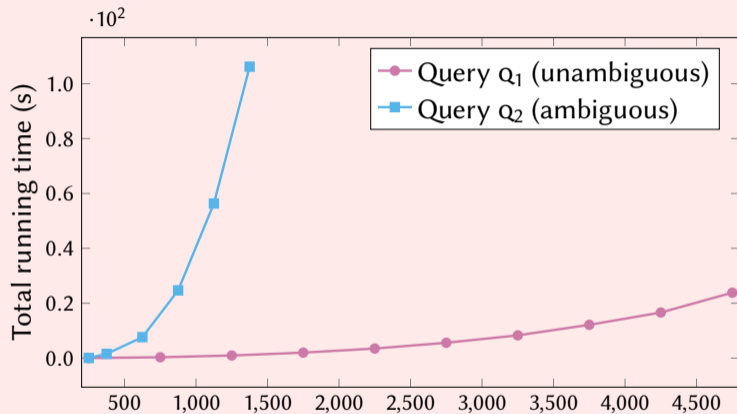
Grammars: Bounded vs. unbounded



$P_1 \mapsto S B$ $B \mapsto S S$ $S \mapsto \sigma;$

$P_2 \mapsto S P_2$ $P_2 \mapsto \sigma$ $S \mapsto \sigma.$

Grammars: Unambiguous vs. ambiguous



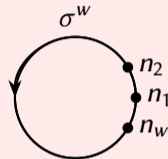
$Q_1 \mapsto S Q_1$

$Q_1 \mapsto \sigma$

$S \mapsto \sigma;$

$Q_2 \mapsto Q_2 Q_2$

$Q_2 \mapsto \sigma.$



Conclusion

Efficient answering path queries with shortest paths is possible.

Future Work

- ▶ Goal-oriented algorithms.
- ▶ High-performance and scalable algorithms.
- ▶ Optimizations for simple grammars (e.g., LL(1), LR(1)).

<https://jhellings.nl/>