

SEQ-IC-LCS Computation of Labeled Graphs

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Outline

- Labeled Graphs
- SEQ-IC-LCS (Constrained LCS)
- Computing SEQ-IC-LCS of Acyclic Labeled Graphs
- Computing SEQ-IC-LCS of Cyclic Labeled Graphs
- Conclusions and Future works

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Labeled Graphs

Labeled Graph $G = (V, E, L)$

A directed graph with vertices labeled by characters.

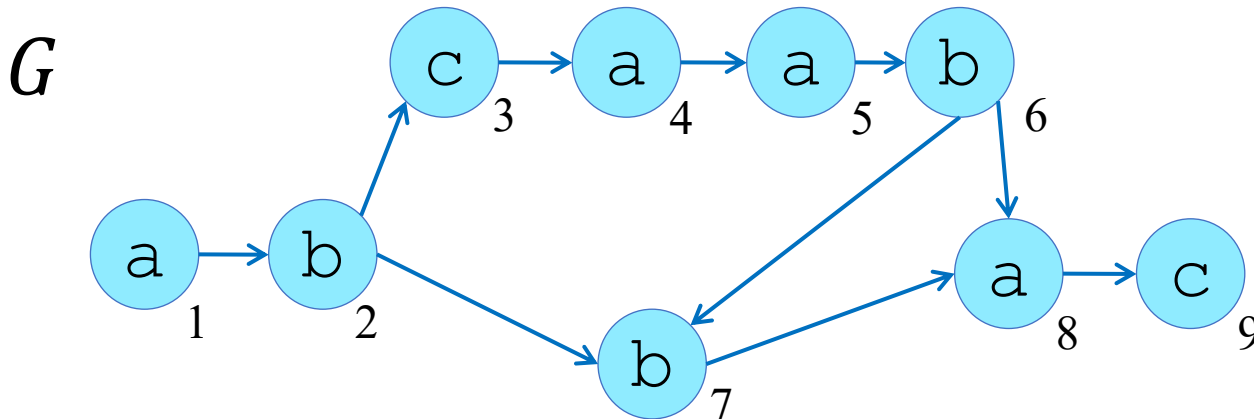
V : the set of vertices

E : the set of edges

$L : V \rightarrow \Sigma$: a labeling function

e.g. $V = \{ v_1, v_2, v_3, v_4, v_5, v_6, v_7, v_8, v_9 \}$

$E = \{ (v_1, v_2), (v_2, v_3), (v_2, v_7), (v_3, v_4), (v_4, v_5), (v_5, v_6), (v_6, v_7), (v_6, v_8), (v_7, v_8), (v_8, v_9) \}$



Labeled Graphs

$L(v)$: the character label of vertex v .

$P(v)$: the set of paths that end at vertex v .

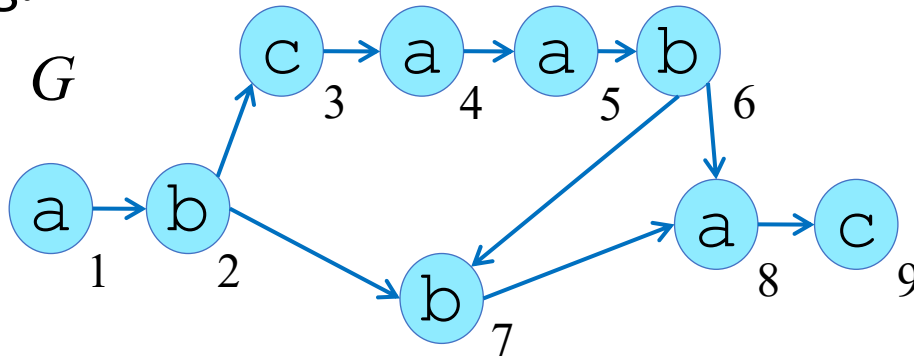
$L(P(v))$: the set of strings spelled by paths in $P(v)$.

$P(G)$: the set of paths in G . ($P(G) = \{P(v) \mid v \in V\}$)

$L(\pi)$: the set of strings spelled by paths in π (: the set of paths) .

$subseq(L(\pi))$: the set of subsequences of strings in $L(\pi)$.

e.g.



$$L(v_7) = b$$

$$P(v_7) = \{v_3v_4v_5v_6v_7, v_1v_2v_7, \dots\}$$

$$L(P(v_7)) = \{caabb, abb, \dots\}$$

$$aca \in subseq(L(P(G)))$$

Known Algorithms on Labeled Graphs

| problem | text | pattern | time complexity |
|----------------------|----------------------------|-----------------------------|--------------------------------|
| Pattern Matching | acyclic graph | string | $O(n+m E)$ [Park & Kim, 1995] |
| | tree | string | $O(n)$ [Akutsu, 1993] |
| | graph | string | $O(n+m E)$ [Amir et al, 1997] |
| Approximate Matching | graph with edit operations | string | NP-complete [Amir et al, 1997] |
| | graph | string with edit operations | $O(m(n+ E))$ [Navarro, 2000] |

n : sum of the length of strings in the text, m : length of the pattern.

| problem | text 1 | text 2 | time complexity |
|----------------------------|---------------|---------------|--|
| Longest Common Substring | acyclic graph | acyclic graph | $O(E_1 E_2)$ [Shimohira et al., 2011] |
| | graph | acyclic graph | |
| Longest Common Subsequence | acyclic graph | acyclic graph | $O(E_1 E_2)$ [Shimohira et al., 2011] |
| | graph | graph | $O(E_1 E_2 + V_1 V_2 \log \Sigma)$ [Shimohira et al., 2011] |

$|E_i|$: the number of edges in text i , $|V_i|$: the number of vertices in text i , $|\Sigma|$: the alphabet size.

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Constrained LCS [Chen et al., 2011]

In the field of molecular biology, there are cases where the same sequence appears between different species, and there are demand to incorporate this into similarity measurements.

In recent years,

Constrained LCS problems for string inputs

derived from the LCS problem are considered.

Constrained LCS [Chen et al., 2011]

There exist four variants of the Constrained LCS problems.

Each of them is to compute a longest string Z such that Z **includes/excludes** the constraint pattern P as a **substring/subsequence** and Z is a common subsequence of the two target strings A and B .

Each problem is called,

| | |
|-------------------|------------------------|
| STR-IC-LCS | (substring, include) |
| STR-EC-LCS | (substring, exclude) |
| SEQ-IC-LCS | (subsequence, include) |
| SEQ-EC-LCS | (subsequence, exclude) |

Previous Work of Constrained LCS and Our Work

| problem | text 1 | text 2 | text 3 | time complexity |
|------------|--------|--------|--------|---|
| STR-IC-LCS | string | string | string | $O(E_1 E_2)$ [Deorowicz, 2012] |
| STR-EC-LCS | string | string | string | $O(E_1 E_2 E_3)$ [Wang et al., 2013] |
| SEQ-IC-LCS | string | string | string | $O(E_1 E_2 E_3)$ [Chin et al., 2004] |
| | | | | |
| | | | | |
| SEQ-EC-LCS | string | string | string | $O(E_1 E_2 E_3)$ [Chen and Chao, 2011] |

$|E_i|$: the number of edges in text i , $|V_i|$: the number of vertices in text i ,
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Previous Work of Constrained LCS and Our Work

| problem | text 1 | text 2 | text 3 | time complexity |
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| STR-EC-LCS | string | string | string | $O(E_1 E_2 E_3)$ [Wang et al., 2013] |
| SEQ-IC-LCS | string | string | string | $O(E_1 E_2 E_3)$ [Chin et al., 2004] |
| | acyclic graph | acyclic graph | acyclic graph | $O(E_1 E_2 E_3)$ (this work) |
| | graph | graph | acyclic graph | $O(E_1 E_2 E_3 + V_1 V_2 V_3 \log \Sigma)$ (this work) |
| SEQ-EC-LCS | string | string | string | $O(E_1 E_2 E_3)$ [Chen and Chao, 2011] |

$|E_i|$: the number of edges in text i , $|V_i|$: the number of vertices in text i ,
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SEQ-IC-LCS

SEQ-IC-LCS of strings A , B and P is a longest string Z such that Z includes P as a subsequence and Z is a common subsequence of A and B .

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e.g. $A = b\ c\ d\ a\ b\ a\ b$
 $B = c\ b\ a\ c\ b\ a\ a\ b\ a$
 $P = c\ a\ a$

$c\ a\ b\ a\ b$ is an SEQ-IC-LCS of string A , B and P .

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 $P = c \ a \ a$

$c \ a \ b \ a \ b$ is an SEQ-IC-LCS of string A, B and P .

Algorithm for SEQ-IC-LCS of strings [Chin et al., 2004]

Previous work of the SEQ-IC-LCS problem for string inputs is based on dynamic programming.

Let C denote the three-dimensional table which stored the length of the SEQ-IC-LCS of $A[1..i]$, $B[1..j]$ and $P[1..k]$ in $C(i,j,k)$ for any $0 \leq i \leq |A|, 0 \leq j \leq |B|, 0 \leq k \leq |P|$.

computing all $C(i,j,k)$
by using the recurrence.

$C(|A|, |B|, |P|)$ is the solution.

| C | j | 0 | 1 | $ B $ | | |
|-------|--------------|---|---|-------|--|--|
| i | \backslash | | | | | |
| 0 | | | | | | |
| 1 | | | | | | |
| | | | | | | |
| | | | | | | |
| | | | | | | |
| $ A $ | | | | | | |

× ($|P| + 1$)
tables

$C(i, j, k)$: the length of SEQ-IC-LCS of $A[1..i]$, $B[1..j]$ and $P[1..k]$.

$$C(i, j, k) = \begin{cases} 0 & \text{if } k = 0 \text{ and } (i = 0 \text{ or } j = 0); \\ -\infty & \text{if } k \neq 0 \text{ and } (i = 0 \text{ or } j = 0); \\ C(i - 1, j - 1, k - 1) & \text{if } i, j, k > 0 \text{ and } A[i] = B[j] = P[k]; \\ C(i - 1, j - 1, k) & \text{if } i, j > 0 \text{ and } A[i] = B[j] \neq P[k]; \\ \max(C(i - 1, j, k), C(i, j - 1, k)) & \text{if } i, j > 0 \text{ and } A[i] \neq B[j]; \end{cases}$$

This algorithm computes the solution in $O(|A||B||P|)$ time.

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Definition about Labeled Graphs

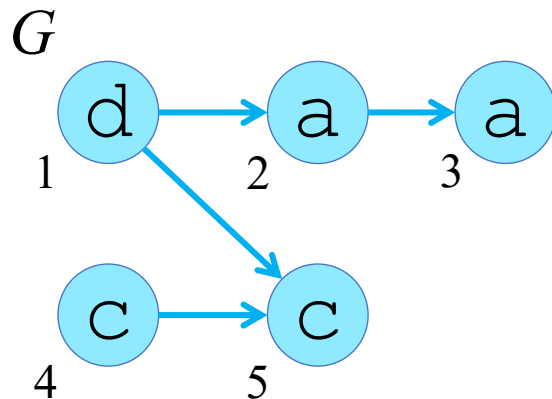
V_s : the set of vertices which has no in-coming edges.

V_e : the set of vertices which has no out-going edges.

$MP(v)$: the set of paths that start at v_s in V_s and end at vertex v .

$MP(G)$: the set of paths that start at v_s in V_s and end at vertex v_e in V_e in G (= maximal paths).

e.g.



$$V_s = \{v_1, v_4\} \quad V_e = \{v_3, v_5\}$$

$$MP(v_5) = \{v_1v_5, v_4v_5\}$$

$$L(MP(v_4)) = \{dc, cc\}$$

$$MP(G) = \{v_1v_2v_3, v_1v_5, v_4v_5\}$$

SEQ-IC-LCS Problem for Acyclic Labeled Graphs

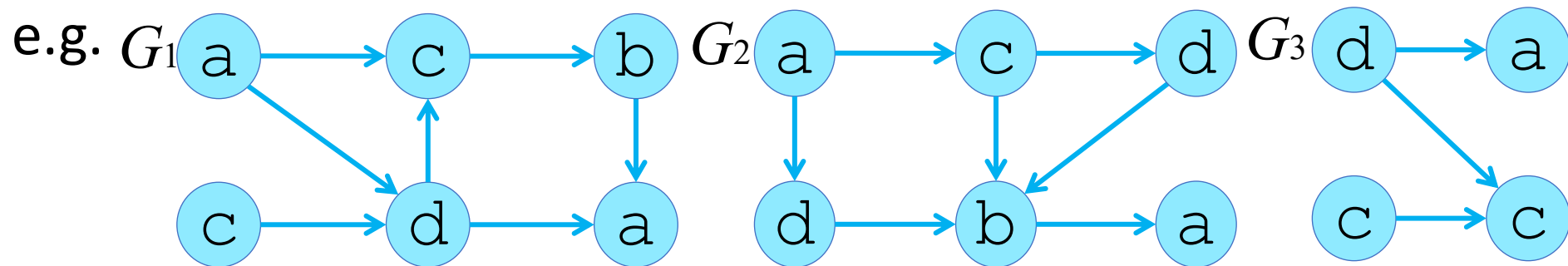
Problem 1

Input : Acyclic labeled graphs $G_1 = (V_1, E_1, L_1)$, $G_2 = (V_2, E_2, L_2)$
and $G_3 = (V_3, E_3, L_3)$

Output : Length of the longest string in the set $\{ z \mid \exists q \in L_3(MP(G_3))$
such that $q \in Subseq(z)$ and $z \in Subseq(G_1) \cap Subseq(G_2) \}$

$MP(G)$: the set of maximal paths in G .

$subseq(G)$: the set of subsequences of strings in G .



SEQ-IC-LCS Problem for Acyclic Labeled Graphs

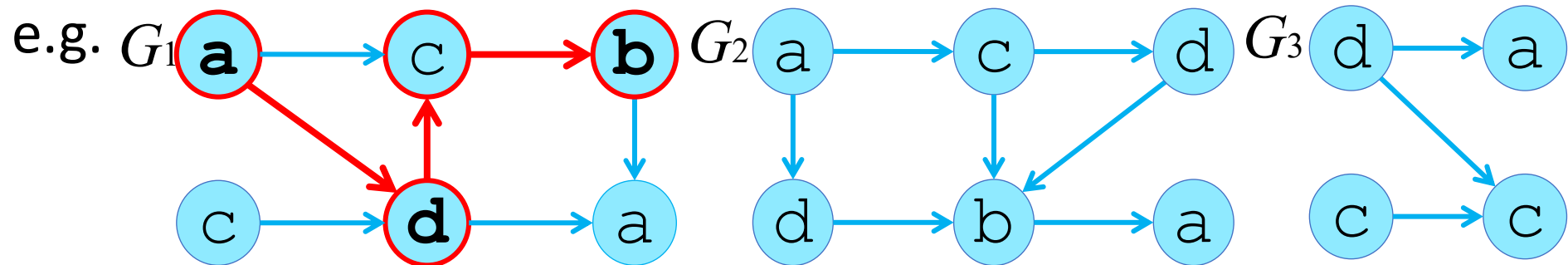
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$MP(G)$: the set of maximal paths in G .

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$Subseq(G_1) = \{a, b, c, d, aa, ab, ac, ad, ba, ca, cb, cc, cd, da, db, dc, aba, aca, acb, ada, \mathbf{adb}, adc, cba, cca, cda, dba, dca, acba, adba, ccba, cdba, cdca, adcba, cdcba\}$

$Subseq(G_2) = \{a, b, c, d, aa, ab, ac, ad, ba, ca, cb, cd, da, db, aba, aca, acb, acd, ada, adb, cba, cda, cdb, dba, acba, adba, cdba, acdba\}$

$L_3(MP(G_3)) = \{cc, da, dc\}$

SEQ-IC-LCS Problem for Acyclic Labeled Graphs

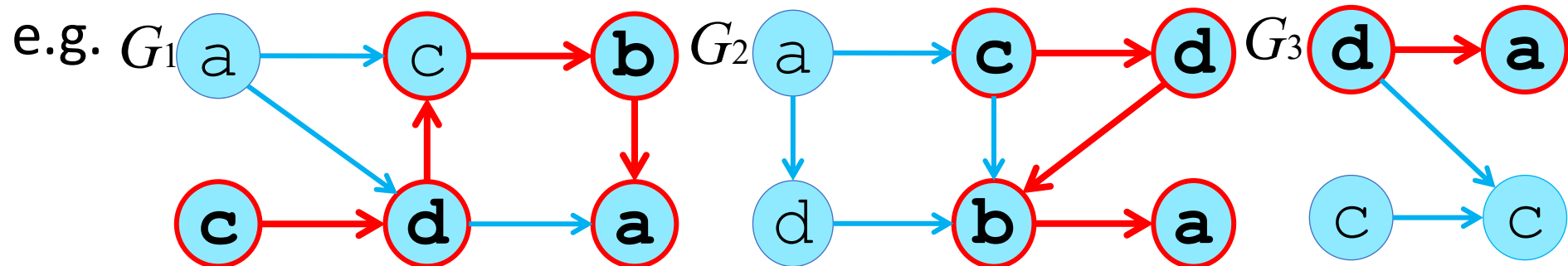
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$MP(G)$: the set of maximal paths in G .

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$Subseq(G_1) = \{a, b, c, d, aa,$
 $ab, ac, ad, ba, ca, cb, cc, cd,$
 $da, db, dc, aba, aca, acb,$
 $ada, adb, adc, cba, cca, cda,$
 $dba, dca, acba, adba, ccba,$
 $**cdba**, cdca, adcba, cdcba\}$

$Subseq(G_2) = \{a, b, c, d, aa,$
 $ab, ac, ad, ba, ca, cb, cd,$
 $da, db, aba, aca, acb, acd,$
 $ada, adb, cba, cda, cdb, dba,$
 $acba, adba, **cdba**, acdba\}$

$L_3(MP(G_3))$
 $= \{cc, **da**, dc\}$

The solution is 4. (**cdba**)

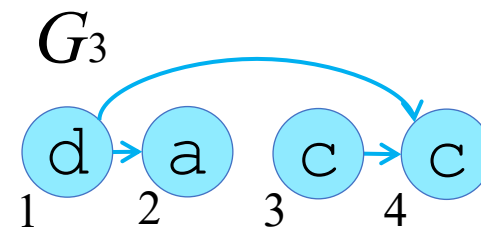
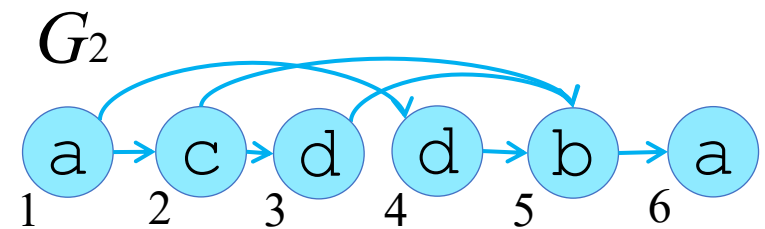
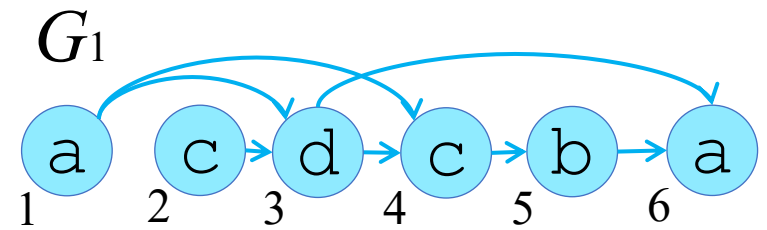
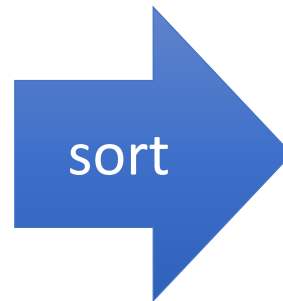
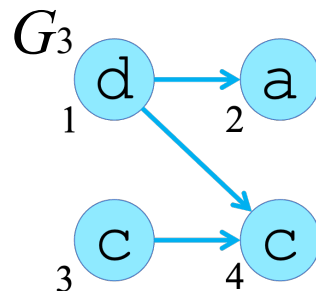
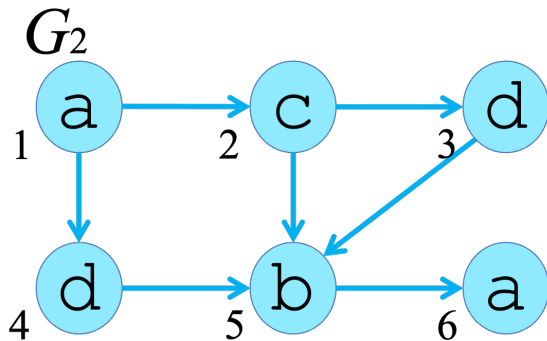
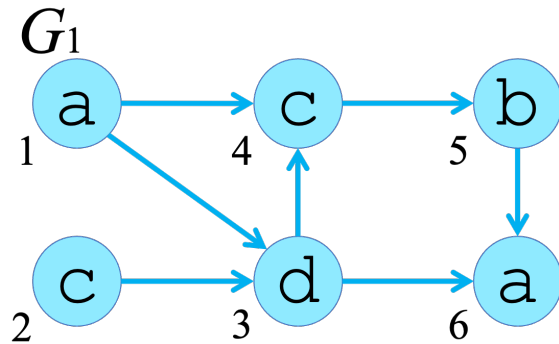
Main Idea of the Algorithm for SEQ-IC-LCS of Acyclic Labeled Graphs

1. Sort vertices of G_1 , G_2 and G_3 in topological order.

Topological Sort

1. Sort vertices of G_1 , G_2 and G_3 in topological order.

e.g.



Main Idea of the Algorithm for SEQ-IC-LCS of Acyclic Labeled Graphs

1. Sort vertices of G_1 , G_2 and G_3 in topological order.

Let C denote the three-dimensional table which stored the length of the SEQ-IC-LCS of $L_1(P(v_{1,i}))$, $L_2(P(v_{2,j}))$ and $L_3(P(v_{3,k}))$ in $C(i,j,k)$ for any $1 \leq i \leq |V_1|$, $1 \leq j \leq |V_2|$, $0 \leq k \leq |V_3|$.

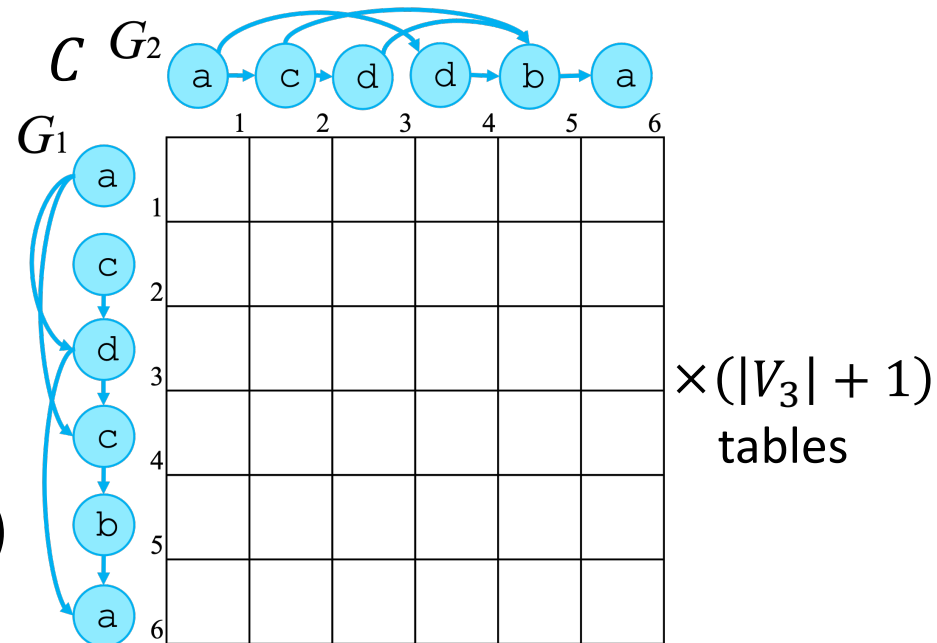
$(v_{1,i} \in V_1, v_{2,j} \in V_2, v_{3,k} \in V_3)$

2. Calculate $C(i,j,k)$ using the recurrence.

$\max_{1 \leq i \leq |V_1|, 1 \leq j \leq |V_2|, v_{3,k}} C(i,j,k)$

is the solution.

$(v_{3,k}$ has no out-going edges in V_3 .)



Recurrence of SEQ-IC-LCS of Acyclic Labeled Graphs

$$C_{i,j,k} = \begin{cases} \text{Recurrence of LCS of Acyclic Labeled Graph} & \text{if } k = 0; \\ \text{[Shimohira et al., 2011]} & \\ 1 + \max \left(\left\{ C_{x,y,z} \mid \begin{array}{l} (v_{1,x}, v_{1,i}) \in E_1, \\ (v_{2,y}, v_{2,j}) \in E_2, \\ (v_{3,z}, v_{3,k}) \in E_3, \\ \text{or } z = 0 \end{array} \right\} \cup \{\gamma\} \right) & \text{if } k > 0 \text{ and} \\ & L_1(v_{1,i}) = L_2(v_{2,j}) \\ & = L_3(v_{3,k}); \\ \max \left(\left\{ 1 + C_{x,y,k} \mid \begin{array}{l} (v_{1,x}, v_{1,i}) \in E_1, \\ (v_{2,y}, v_{2,j}) \in E_2 \end{array} \right\} \cup \{-\infty\} \right) & \text{if } k > 0 \text{ and} \\ & L_1(v_{1,i}) = L_2(v_{2,j}) \\ & \neq L_3(v_{3,k}); \\ \max \left(\begin{array}{l} \{ C_{x,j,k} \mid (v_{1,x}, v_{1,i}) \in E_1 \} \cup \\ \{ C_{i,y,k} \mid (v_{2,y}, v_{2,j}) \in E_2 \} \cup \{-\infty\} \end{array} \right) & \text{otherwise.} \end{cases}$$

where

$$\gamma = \begin{cases} 0 & \text{if } v_{1,i} \text{ does not have in-coming edges at all or } v_{2,j} \text{ does not have} \\ & \text{in-coming edges at all, and } v_{3,k} \text{ does not have in-coming edges;} \\ -\infty & \text{otherwise.} \end{cases}$$

Main Idea of the Algorithm for SEQ-IC-LCS of Acyclic Labeled Graph

1. Sort vertices of G_1 , G_2 and G_3 in topological order.

Let C denote the three-dimensional table which stored the length of the SEQ-IC-LCS of $L_1(P(v_{1,i}))$, $L_2(P(v_{2,j}))$ and $L_3(P(v_{3,k}))$ in $C(i,j,k)$ for any $1 \leq i \leq |V_1|$, $1 \leq j \leq |V_2|$, $0 \leq k \leq |V_3|$.

$(v_{1,i} \in V_1, v_{2,j} \in V_2, v_{3,k} \in V_3)$

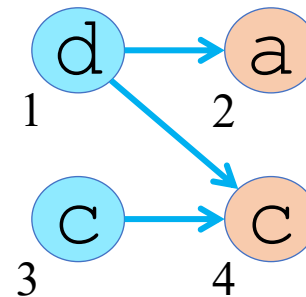
2. Calculate $C(i,j,k)$ using the recurrence.

$$\max_{1 \leq i \leq |V_1|, 1 \leq j \leq |V_2|, v_{3,k}} C(i,j,k)$$

is the solution.

$(v_{3,k}$ has no out-going edges in V_3 .)

G_3



$$L_3(MP(G_3)) = \{c\mathbf{c}, d\mathbf{a}, d\mathbf{c}\}$$

Time Complexity

1. Sort vertices of G_1, G_2 and G_3 in topological order.

Let C denote the three-dimensional table which stored the length of the SEQ-IC-LCS of $L_1 (P(v_{1,i})), L_2 (P(v_{2,j})), L_3 (P(v_{3,k}))$ in $C(i, j, k)$ for any $1 \leq i \leq |V_1|, 1 \leq j \leq |V_2|, 1 \leq k \leq |V_3|$ ($v_{1,i} \in V_1, v_{2,j} \in V_2, v_{3,k} \in V_3$)

linear time

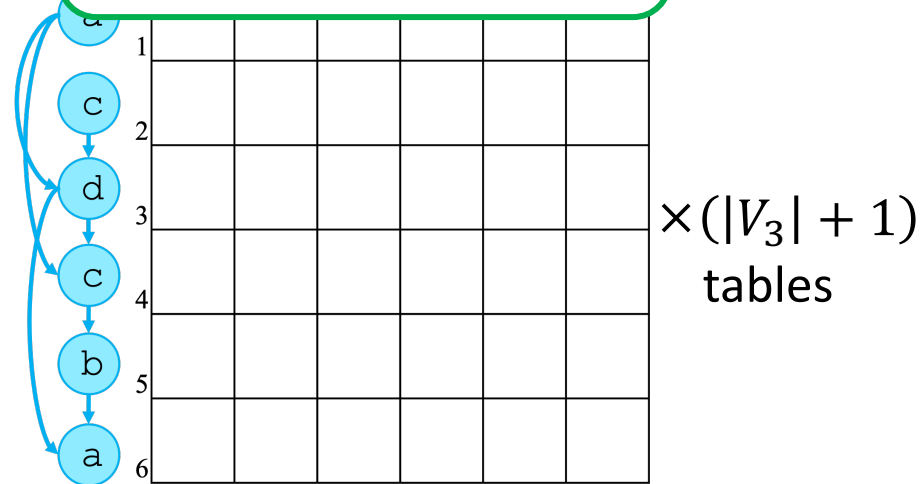
2. Calculate $C(i, j, k)$ using the recurrence.

$O(|E_1||E_2||E_3|)$ time

$$\max_{1 \leq i \leq |V_1|, 1 \leq j \leq |V_2|, v_{3,k}} C(i, j, k)$$

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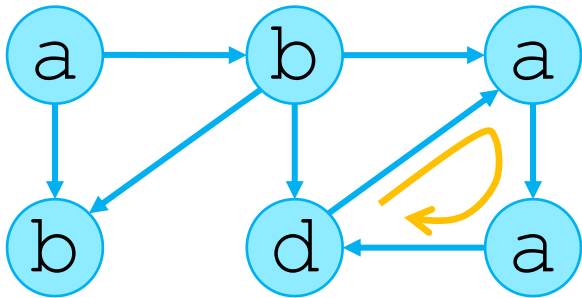
SEQ-IC-LCS Problem for Cyclic Labeled Graphs

Problem 2

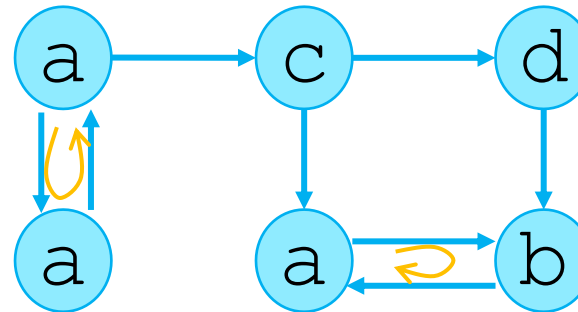
Input : Cyclic labeled graphs $G_1 = (V_1, E_1, L_1)$ and $G_2 = (V_2, E_2, L_2)$,
and Acyclic labeled graphs $G_3 = (V_3, E_3, L_3)$

Output : - ∞ (if some z are infinite.)
- Length of longest string in the set $\{ z \mid \exists q \in L_3(MP(G_3))$
such that $q \in Subseq(z)$ and $z \in Subseq(G_1) \cap Subseq(G_2) \}$
(otherwise)

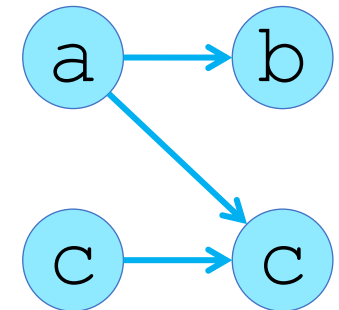
e.g. 1 G_1



G_2



G_3



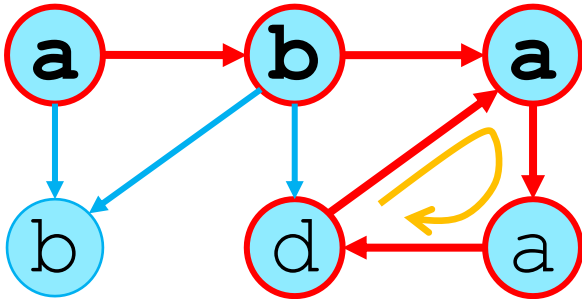
SEQ-IC-LCS Problem for Cyclic Labeled Graphs

Problem 2

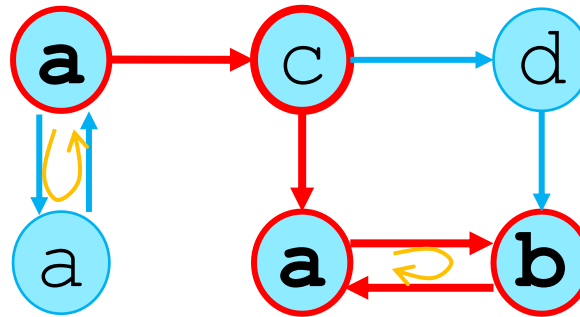
Input : Cyclic labeled graphs $G_1 = (V_1, E_1, L_1)$ and $G_2 = (V_2, E_2, L_2)$,
and Acyclic labeled graphs $G_3 = (V_3, E_3, L_3)$

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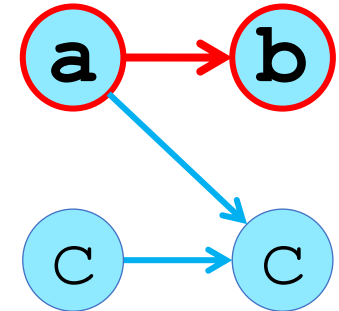
e.g. 1 G_1



G_2



G_3



$Subseq(G_1) \cap Subseq(G_2) = \{a, b, d, \dots, \mathbf{aba}^\infty, \dots\}$

$L_3(MP(G_3))$
 $= \{\mathbf{ab}, ac, cc\}$

The solution is ∞ . (\mathbf{aba}^∞)

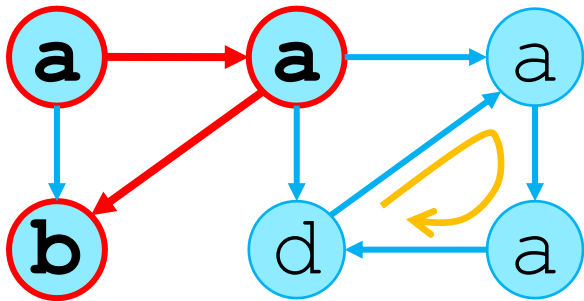
SEQ-IC-LCS Problem for Cyclic Labeled Graphs

Problem 2

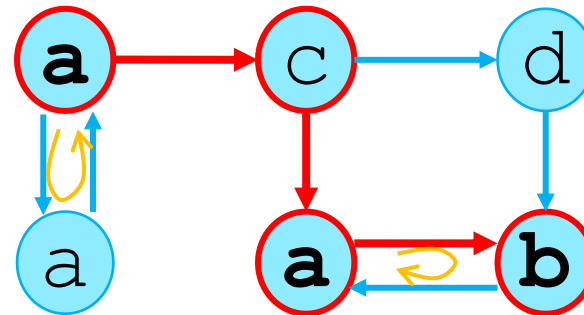
Input : Cyclic labeled graphs $G_1 = (V_1, E_1, L_1)$ and $G_2 = (V_2, E_2, L_2)$,
and Acyclic labeled graphs $G_3 = (V_3, E_3, L_3)$

Output : - ∞ (if some z are infinite.)
- Length of longest string in the set $\{z \mid \exists q \in L_3(MP(G_3))$
such that $q \in Subseq(z)$ and $z \in Subseq(G_1) \cap Subseq(G_2)\}$
(otherwise)

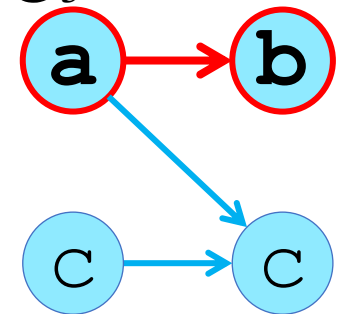
e.g. 2 G_1



G_2



G_3



$Subseq(G_1) \cap Subseq(G_2) = \{a, b, d, \dots, \mathbf{aab}, \dots\}$

$L_3(MP(G_3))$
 $= \{\mathbf{ab}, ac, cc\}$

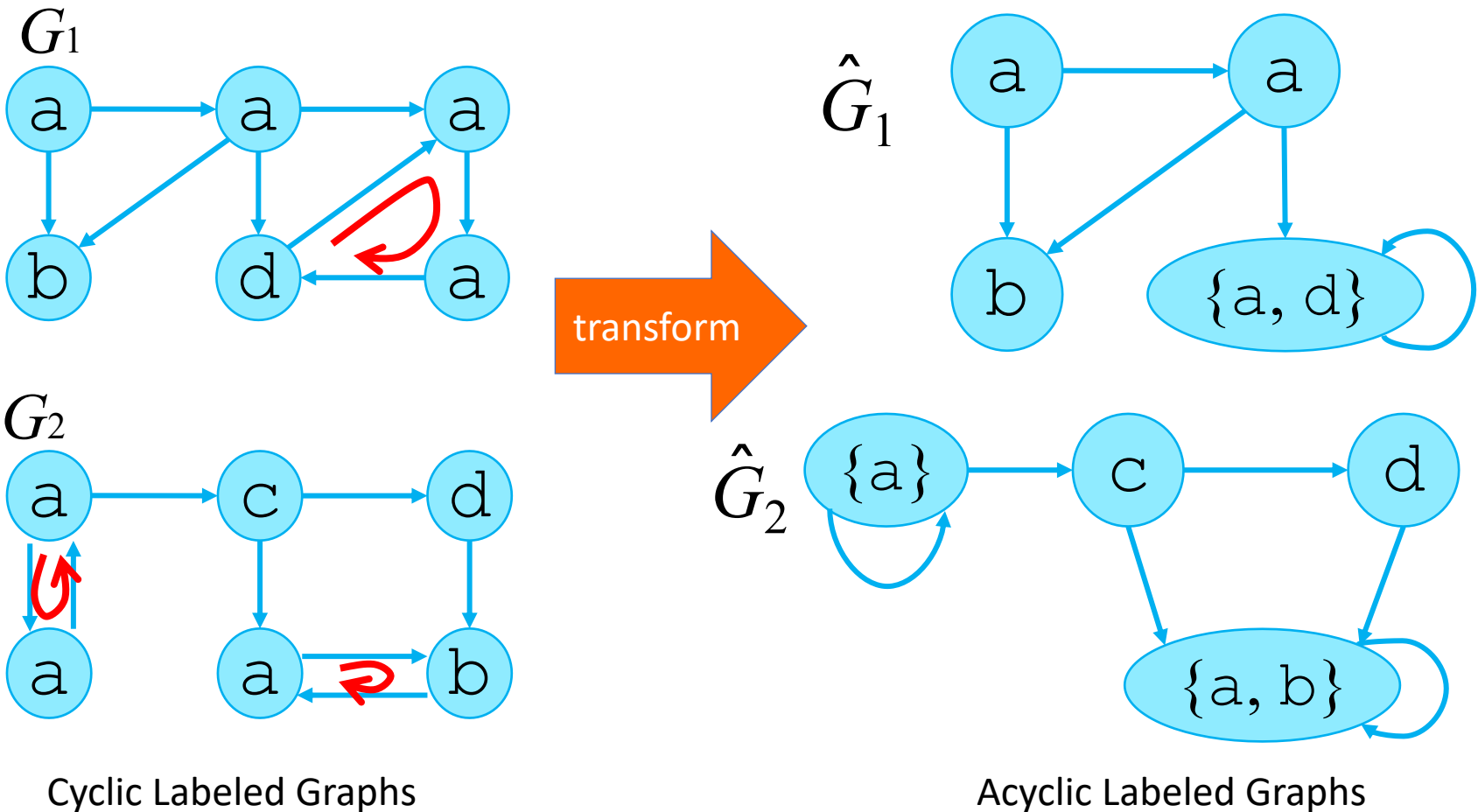
The solution is 3. (**aab**)

Main Idea of the Algorithm for SEQ-IC-LCS of Cyclic Labeled Graphs

1. Transform G_1 and G_2 into \hat{G}_1 and \hat{G}_2 based on the **strongly connected components**.

Strongly Connected Components

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Main Idea of the Algorithm for SEQ-IC-LCS of Cyclic Labeled Graphs

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2. Sort vertices of \hat{G}_1 , \hat{G}_2 and G_3 in topological order.

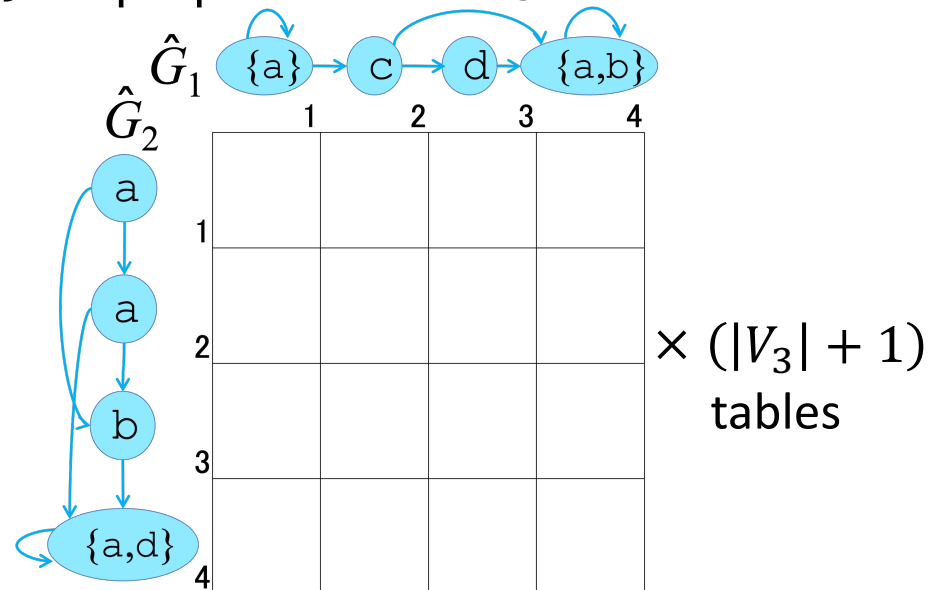
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Let C denote the three-dimensional table which stored the length of the SEQ-IC-LCS of $\hat{L}_1 (P(\hat{v}_{1,i}))$, $\hat{L}_2 (P(\hat{v}_{2,j}))$ and $L_3 (P(v_{3,k}))$ in $C(i,j,k)$ for any $1 \leq i \leq |\hat{V}_1|$, $1 \leq j \leq |\hat{V}_2|$, $0 \leq k \leq |V_3|$.

($\hat{v}_{1,i} \in \hat{V}_1$, $\hat{v}_{2,j} \in \hat{V}_2$, $v_{3,k} \in V_3$)



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 $(\hat{v}_{1,i} \in \hat{V}_1, \hat{v}_{2,j} \in \hat{V}_2, v_{3,k} \in V_3)$

3. Precompute the result of conditional expression of recurrence for all $1 \leq i \leq |\hat{V}_1|$, $1 \leq j \leq |\hat{V}_2|$, $0 \leq k \leq |\hat{V}_3|$.

Precompute the Result of Conditional Expressions of Recurrence

$$\hat{L}_1(\hat{v}_{1,i}) \cap \hat{L}_2(\hat{v}_{2,j}) \cap \{L_3(v_{3,k})\} \neq \emptyset$$

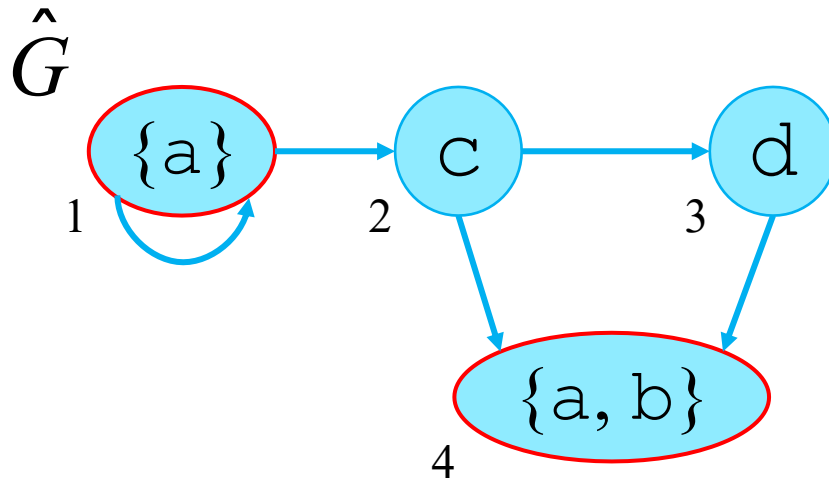
$$\hat{L}_1(\hat{v}_{1,i}) \cap \hat{L}_2(\hat{v}_{2,j}) \cap \{L_3(v_{3,k})\} = \emptyset \text{ and } \hat{L}_1(\hat{v}_{1,i}) \cap \hat{L}_2(\hat{v}_{2,j}) \neq \emptyset$$

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$L(v)$: the character label of vertex v .

\hat{v} : the vertex transformed G_1 based on the strongly connected components.

$\hat{L}(\hat{v})$: the set of characters labeled to vertex \hat{v} .



$$\hat{L}(\hat{v}_1) = \{ a \}$$

$$\hat{L}(\hat{v}_4) = \{ a, b \}$$

$$\hat{L}(\hat{v}_1) \cap \hat{L}(\hat{v}_4) = \{ a \}$$

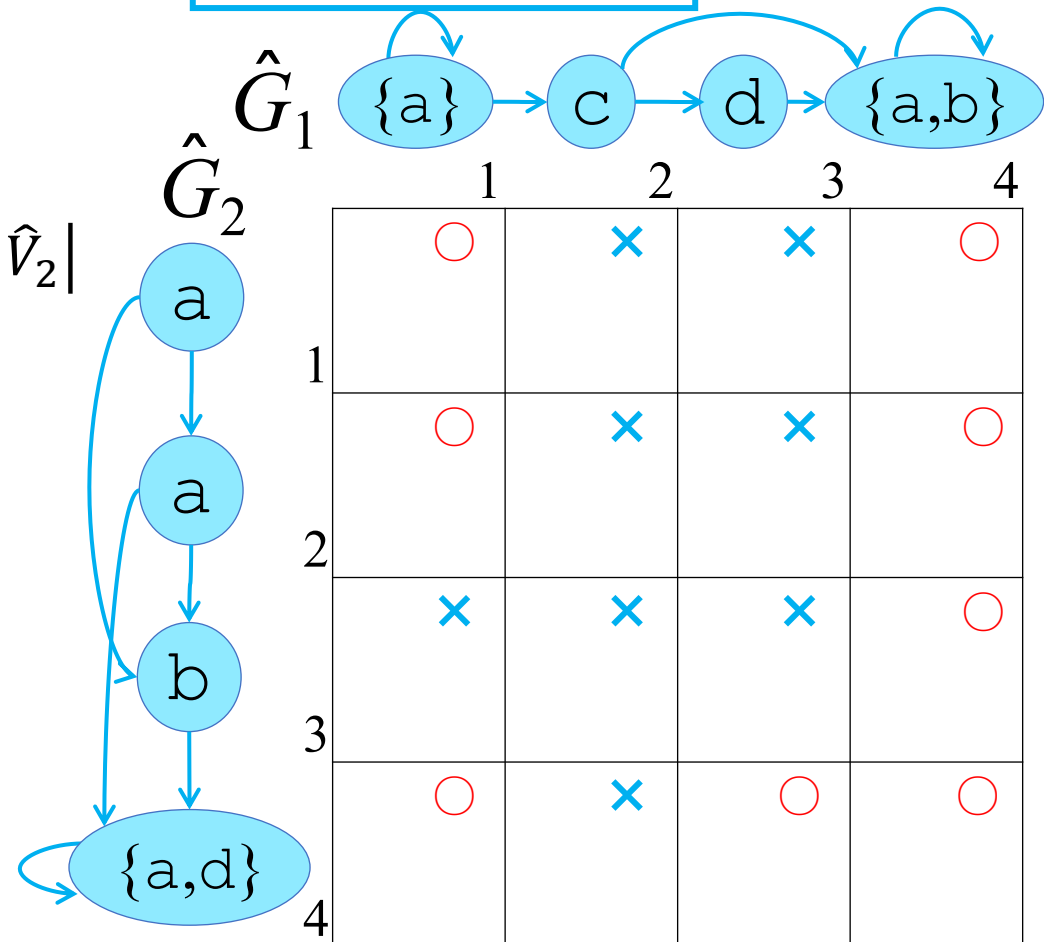
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Compute $\hat{L}_1(\hat{v}_{1,i}) \cap \hat{L}_2(\hat{v}_{2,j})$
for all $1 \leq i \leq |\hat{V}_1|$ and $1 \leq j \leq |\hat{V}_2|$
using balanced tree.



Precompute the Result of Conditional Expressions of Recurrence

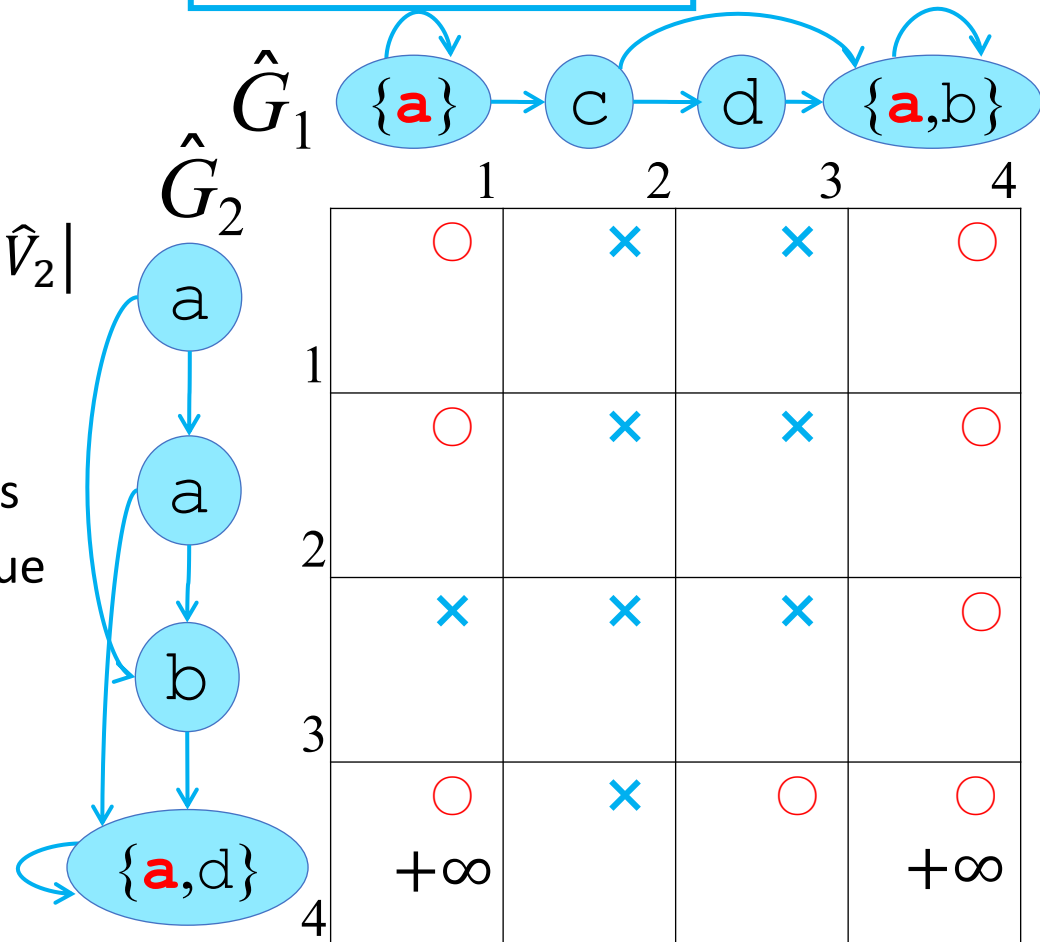
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(If both $\hat{v}_{1,i}$ and $\hat{v}_{2,j}$ are cyclic vertices
and $\hat{L}_1(\hat{v}_{1,i}) \cap \hat{L}_2(\hat{v}_{2,j}) \neq \emptyset$, the value
 $C_{i,j,k}$ is incremented by ∞ .)



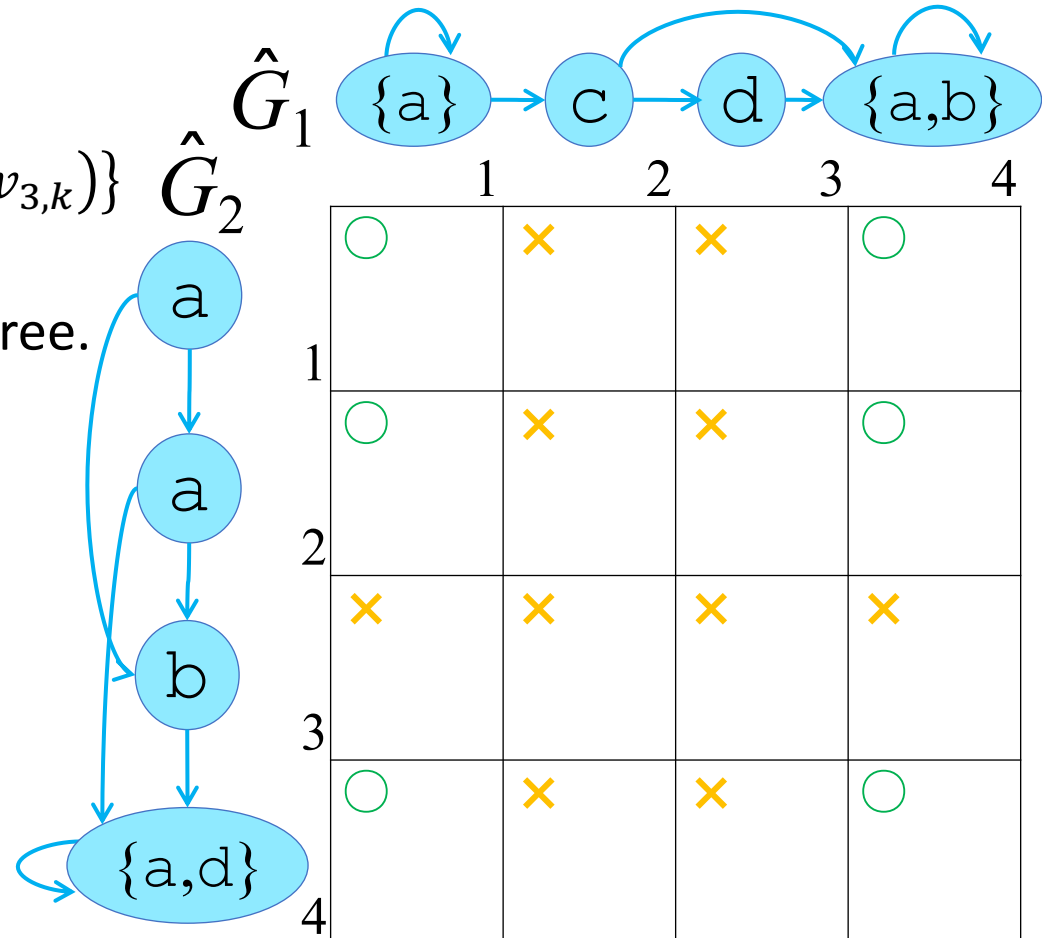
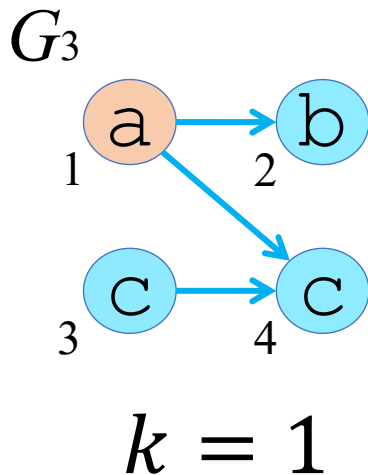
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 and $1 \leq k \leq |V_3|$ using balanced tree.



Main Idea of the Algorithm for SEQ-IC-LCS of Cyclic Labeled Graphs

1. Transform G_1 and G_2 into \hat{G}_1 and \hat{G}_2 based on the strongly connected components.

2. Sort vertices of \hat{G}_1 , \hat{G}_2 and G_3 in topological order.

Let C denote the three-dimensional table which stored the length of the SEQ-IC-LCS of $\hat{L}_1 \left(P(\hat{v}_{1,i}) \right)$, $\hat{L}_2 \left(P(\hat{v}_{2,j}) \right)$ and $L_3 \left(P(v_{3,k}) \right)$ in $C(i,j,k)$ for any $1 \leq i \leq |\hat{V}_1|$, $1 \leq j \leq |\hat{V}_2|$, $0 \leq k \leq |V_3|$.
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3. Precompute the result of conditional expression of recurrence for all $1 \leq i \leq |\hat{V}_1|$, $1 \leq j \leq |\hat{V}_2|$, $0 \leq k \leq |\hat{V}_3|$.

4. Calculate $C(i, j, k)$ using the recurrence.

$\max_{1 \leq i \leq |V_1|, 1 \leq j \leq |V_2|, v_{3,k}}$ $C(i, j, k)$ is the solution.

($v_{3,k}$ has no out-going edges in V_3 .)

Recurrence of SEQ-IC-LCS of Cyclic Labeled Graphs

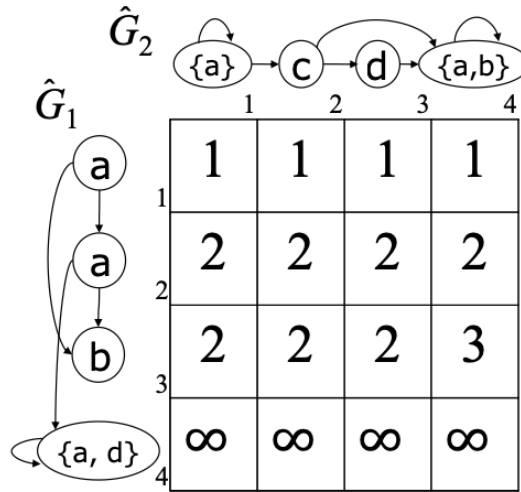
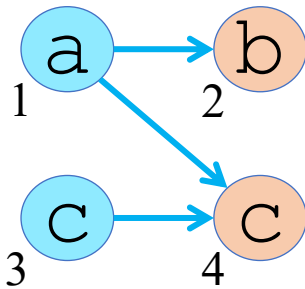
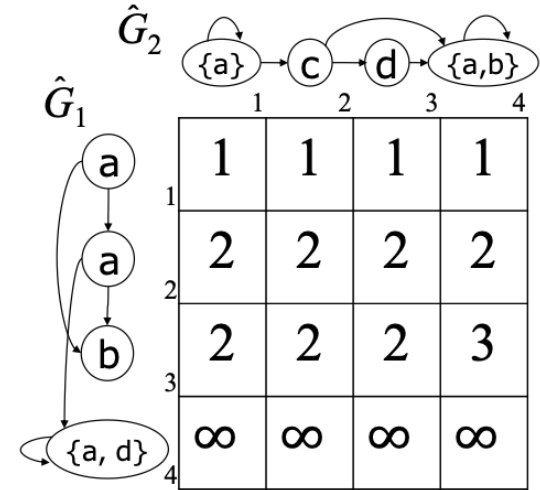
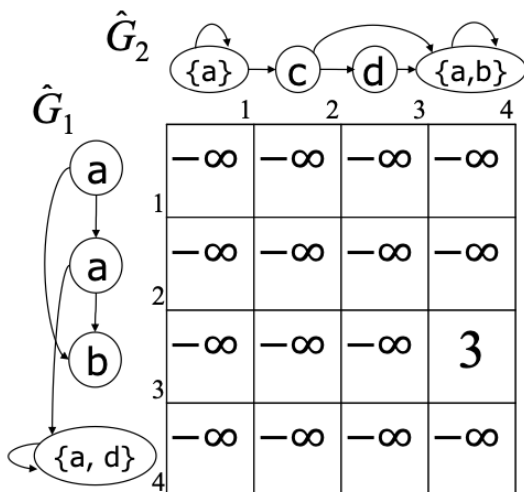
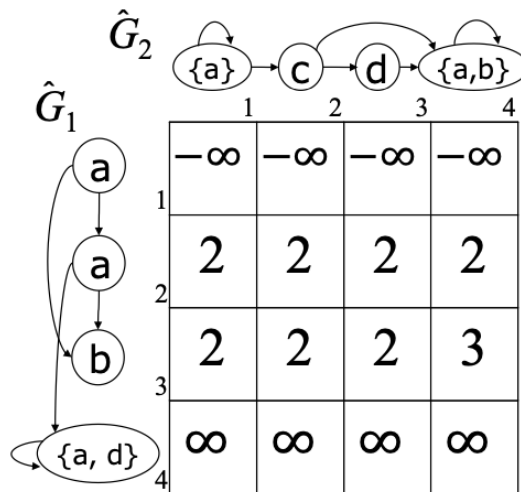
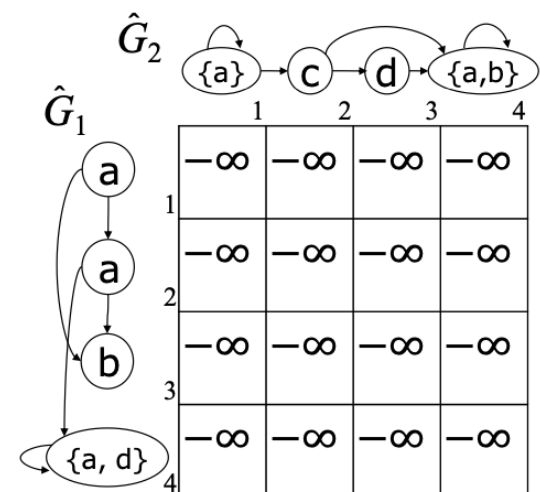
$$C_{i,j,k} = \begin{cases} \delta + \max \left(\left\{ C_{i,j,k} \mid \begin{array}{l} (\hat{v}_{1,x}, \hat{v}_{1,i}) \in \hat{E}_1, \\ (\hat{v}_{2,y}, \hat{v}_{2,j}) \in \hat{E}_2 \end{array} \right\} \cup \{0\} \right) & \text{if } k = 0 \text{ and} \\ & \hat{L}_1(\hat{v}_{1,i}) \cap \hat{L}_2(\hat{v}_{2,j}) \neq \emptyset; \\ \max \left(\left\{ C_{x,j,k} \mid (\hat{v}_{1,x}, \hat{v}_{1,i}) \in \hat{E}_1 \right\} \cup \right. \\ \left. \left\{ C_{i,y,k} \mid (\hat{v}_{2,y}, \hat{v}_{2,j}) \in \hat{E}_2 \right\} \cup \{0\} \right) & \text{if } k = 0 \text{ and} \\ & \hat{L}_1(\hat{v}_{1,i}) \cap \hat{L}_2(\hat{v}_{2,j}) = \emptyset; \\ \delta + \max \left(\left(\left\{ C_{x,y,z} \mid \begin{array}{l} (\hat{v}_{1,x}, \hat{v}_{1,i}) \in \hat{E}_1, \\ (\hat{v}_{2,y}, \hat{v}_{2,j}) \in \hat{E}_2, \\ (v_{3,z}, v_{3,k}) \in E_3 \end{array} \right\} \cup \{\gamma\} \right) \right) & \text{if } k > 0 \text{ and} \\ & \hat{L}_1(\hat{v}_{1,i}) \cap \hat{L}_2(\hat{v}_{2,j}) \cap \{L_3([v_{3,k}])\} \\ & \neq \emptyset; \\ \max \left(\left\{ \delta + C_{x,y,k} \mid \begin{array}{l} (\hat{v}_{1,x}, \hat{v}_{1,i}) \in \hat{E}_1, \\ (\hat{v}_{2,y}, \hat{v}_{2,j}) \in \hat{E}_2 \end{array} \right\} \cup \{-\infty\} \right) & \text{if } k > 0, \\ & \hat{L}_1(\hat{v}_{1,i}) \cap \hat{L}_2(\hat{v}_{2,j}) \cap \{L_3(v_{3,k})\} \\ & = \emptyset, \text{ and } \hat{L}_1(\hat{v}_{1,i}) \cap \hat{L}_2(\hat{v}_{2,j}) \neq \emptyset; \\ \max \left(\left\{ C_{x,j,k} \mid (\hat{v}_{1,x}, \hat{v}_{1,i}) \in \hat{E}_1 \right\} \cup \right. \\ \left. \left\{ C_{i,y,k} \mid (\hat{v}_{2,y}, \hat{v}_{2,j}) \in \hat{E}_2 \right\} \cup \{-\infty\} \right) & \text{otherwise,} \end{cases}$$

where

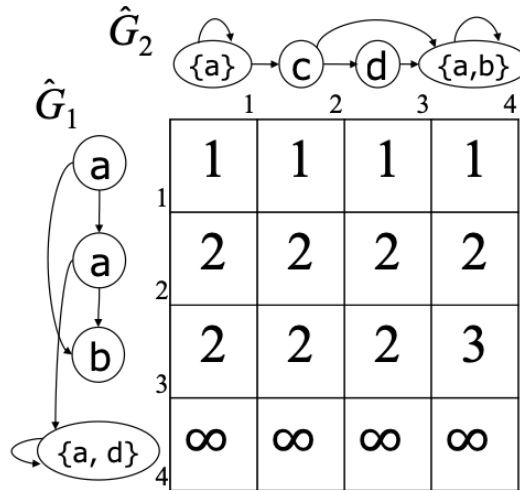
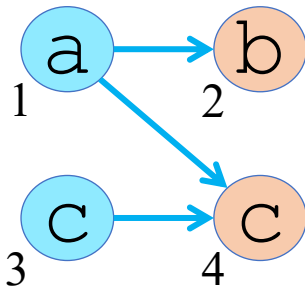
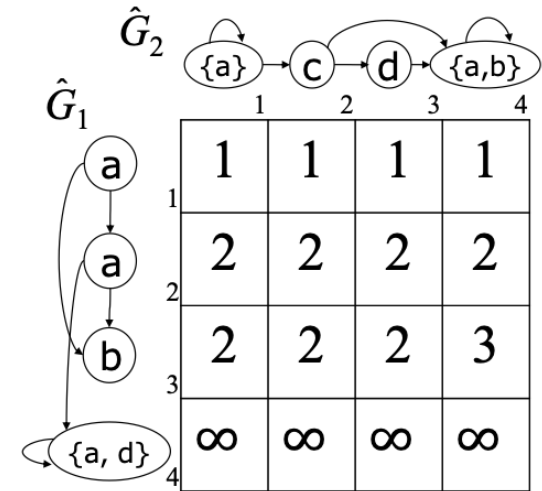
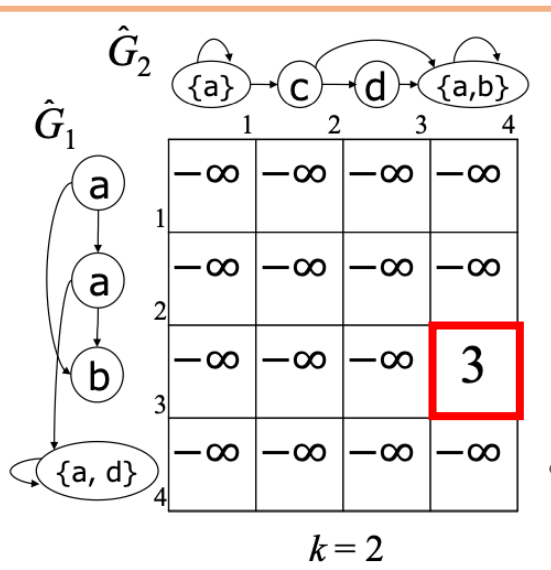
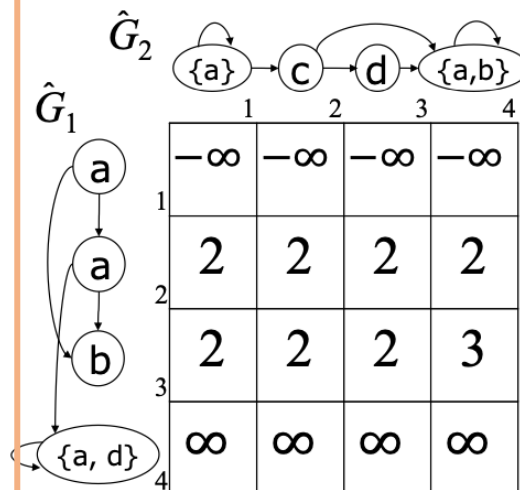
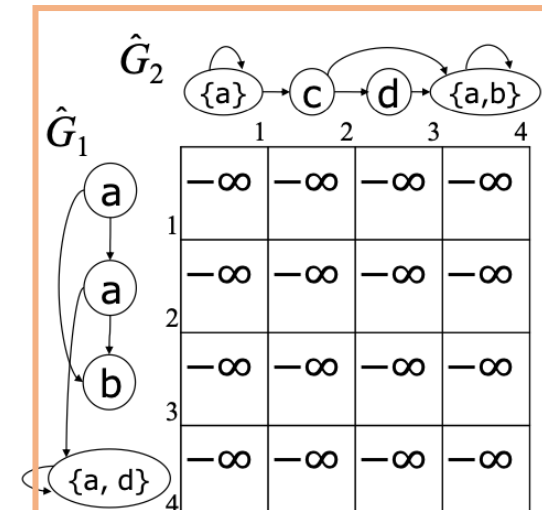
$$\delta = \begin{cases} \infty & \text{if both } \hat{L}_1(\hat{v}_{1,i}) \text{ and } \hat{L}_2(\hat{v}_{2,j}) \text{ are cyclic vertices;} \\ 1 & \text{otherwise,} \end{cases}$$

$$\gamma = \begin{cases} 0 & \text{if } \hat{v}_{1,i} \text{ does not have in-coming edges at all or } \hat{v}_{2,j} \text{ does not have} \\ & \text{in-coming edges at all, and } v_{3,k} \text{ does not have in-coming edges;} \\ -\infty & \text{otherwise.} \end{cases}$$

Tables computed by using the recurrence

 G_3

 $k=0$

 $k=1$

 $k=2$

 $k=3$

 $k=4$

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Time Complexity

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Let C denote the three-dimensional table with

the SEQ-IC-LCS of $\hat{L}_1 \left(P(\hat{v}_{1,i}) \right), \hat{L}_2 \left(P(\hat{v}_{2,j}) \right)$

$C(i,j,k)$ for any $1 \leq i \leq |\hat{V}_1|, 1 \leq j \leq |\hat{V}_2|, 0 \leq k \leq |V_3|$.

$(\hat{v}_{1,i} \in \hat{V}_1, \hat{v}_{2,j} \in \hat{V}_2, v_{3,k} \in V_3)$

linear time

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4. Calculate $C(i, j, k)$ using the recurrence.

$\max_{1 \leq i \leq |V_1|, 1 \leq j \leq |V_2|, v_{3,k}}$ $C(i, j, k)$ is the solution.

$(v_{3,k}$ has no out-going edges in V_3 .)

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Let C denote the three dimensional table with

$O(|\hat{V}_1| |\hat{V}_2| |V_3| \log|\Sigma|)$ time

(Balanced tree can search a character in $O(\log|\Sigma|)$ time.)

($\hat{v}_{1,i} \in V_1, \hat{v}_{2,j} \in V_2, v_{3,k} \in V_3$)

$C(i, j, k) = P(\hat{v}_{2,j})$
 $j \leq |\hat{V}_2|, 0 \leq k \leq |V_3|.$

linear time

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 $j \leq |\hat{V}_2|, 0 \leq k \leq |V_3|.$

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Time Complexity

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$O(|\hat{V}_1||\hat{V}_2||V_3| \log|\Sigma|)$ time

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linear time

$P(\hat{v}_{2,j})$
 $j \leq |\hat{V}_2|, 0 \leq k \leq |V_3|.$

$(\hat{v}_{1,i}$

3. Pr
 recur

The total time complexity is

$O(|E_1||E_2||E_3| + |V_1||V_2||V_3|\log|\Sigma|)$ time.

4. Ca

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$(v_{3,k}$ has

$O(|\hat{E}_1||\hat{E}_2||E_3|)$ time

Outline

- Labeled Graphs
- SEQ-IC-LCS (Constrained LCS)
- Computing SEQ-IC-LCS of Acyclic Labeled Graphs
- Computing SEQ-IC-LCS of Cyclic Labeled Graphs
- **Conclusions and Future works**

Conclusions

| problem | text 1 | text 2 | text 3 | Time complexity |
|------------|---------------|---------------|---------------|---|
| STR-IC-LCS | string | string | string | $O(E_1 E_2)$ [Deorowicz, 2012] |
| STR-EC-LCS | string | string | string | $O(E_1 E_2 E_3)$ [Wang et al., 2013] |
| SEQ-IC-LCS | string | string | string | $O(E_1 E_2 E_3)$ [Chin et al., 2004] |
| | acyclic graph | acyclic graph | acyclic graph | $O(E_1 E_2 E_3)$ (this work) |
| | graph | graph | acyclic graph | $O(E_1 E_2 E_3 + V_1 V_2 V_3 \log \Sigma)$ (this work) |
| SEQ-EC-LCS | string | string | string | $O(E_1 E_2 E_3)$ [Chen and Chao, 2011] |

$|E_i|$: the number of edges in text i , $|V_i|$: the number of vertices in text i ,
 $|\Sigma|$: the alphabet size .

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 $|\Sigma|$: the alphabet size .

It is likely that these SEQ-IC-LCS algorithms are optimal as we proved $O(n^{3-\varepsilon})$ ($\varepsilon > 0$) time conditional lower bound based on SETH (Strongly Exponential Time Hypothesis).

Future work

| problem | text 1 | text 2 | text 3 | Time complexity |
|------------|---------------|---------------|---------------|---|
| STR-IC-LCS | string | string | string | $O(E_1 E_2)$ [Deorowicz, 2012] |
| STR-EC-LCS | string | string | string | $O(E_1 E_2 E_3)$ [Wang et al., 2013] |
| SEQ-IC-LCS | string | string | string | $O(E_1 E_2 E_3)$ [Chin et al., 2004] |
| | acyclic graph | acyclic graph | acyclic graph | $O(E_1 E_2 E_3)$ (this work) |
| | graph | graph | acyclic graph | $O(E_1 E_2 E_3 + V_1 V_2 V_3 \log \Sigma)$ (this work) |
| SEQ-EC-LCS | string | string | string | $O(E_1 E_2 E_3)$ [Chen and Chao, 2011] |

- SEQ-EC-LCS problem for labeled graphs could be solved by similar methods.
- STR-IC/EC-LCS problems for labeled graphs are open.