

# Polynomial Time Pattern Matching Algorithm for Ordered Graph Patterns

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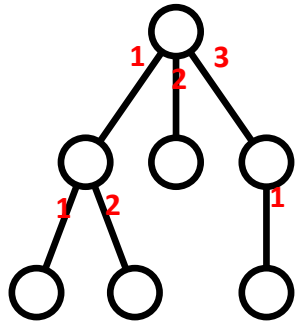
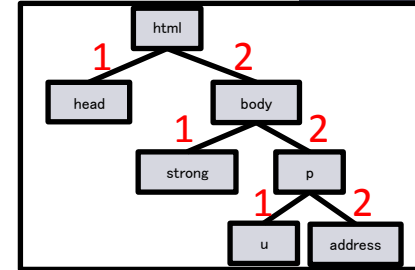
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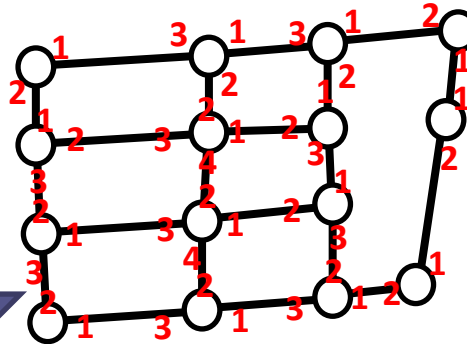
# Background

Structured data such as Web pages, TEX sources, CAD and MAP are modeled by graphs each of whose vertices has ordered neighbors.

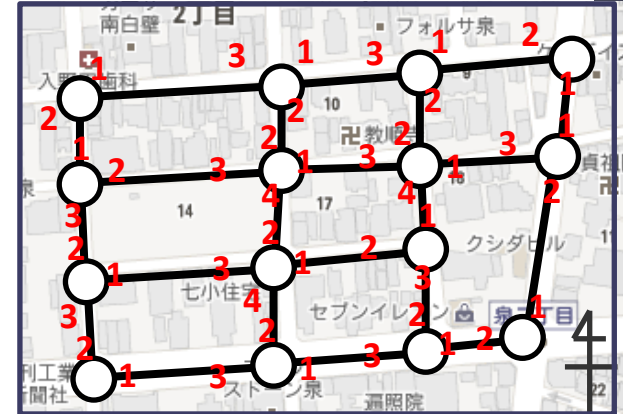
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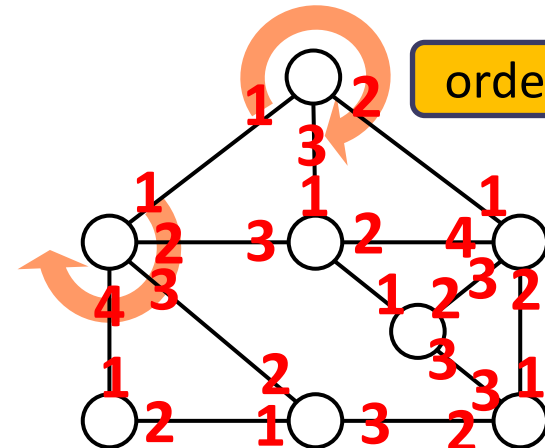
ordered tree



Planar map



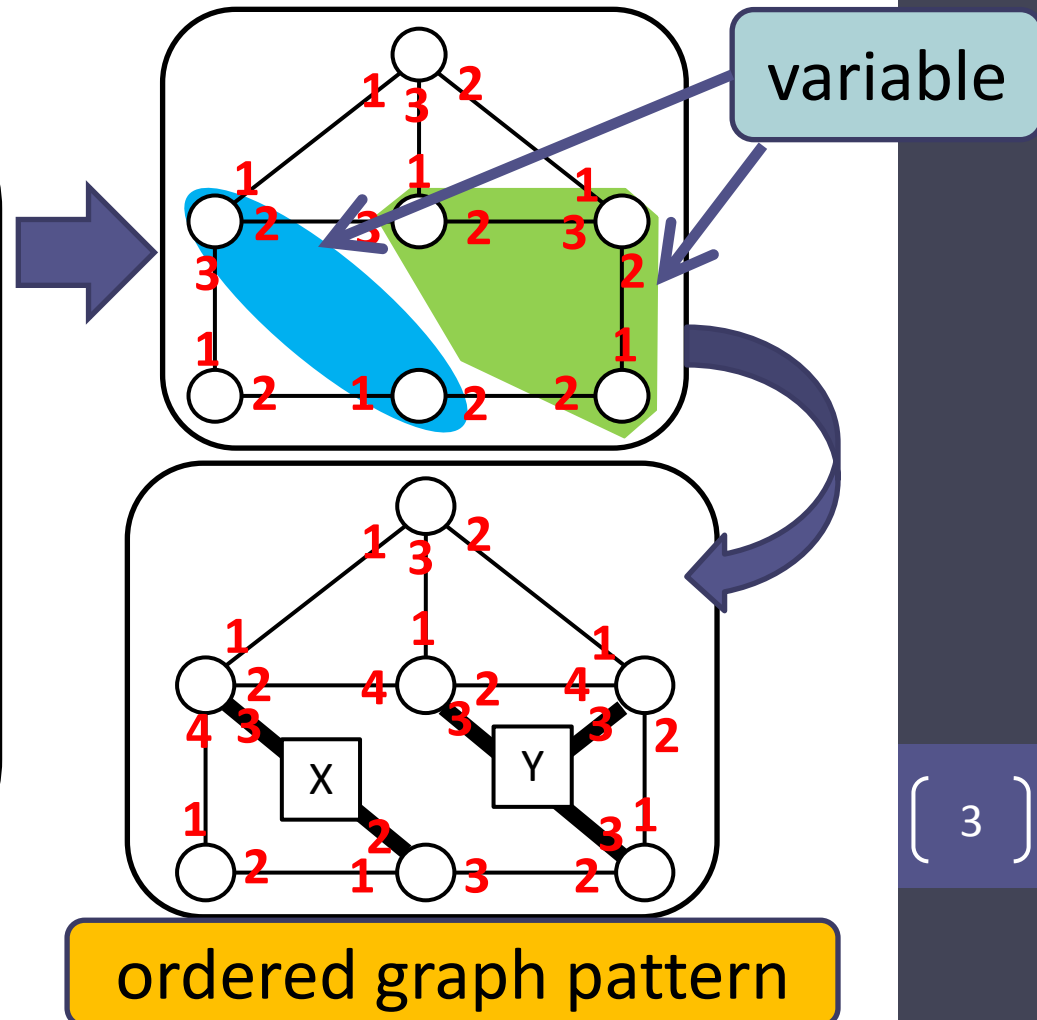
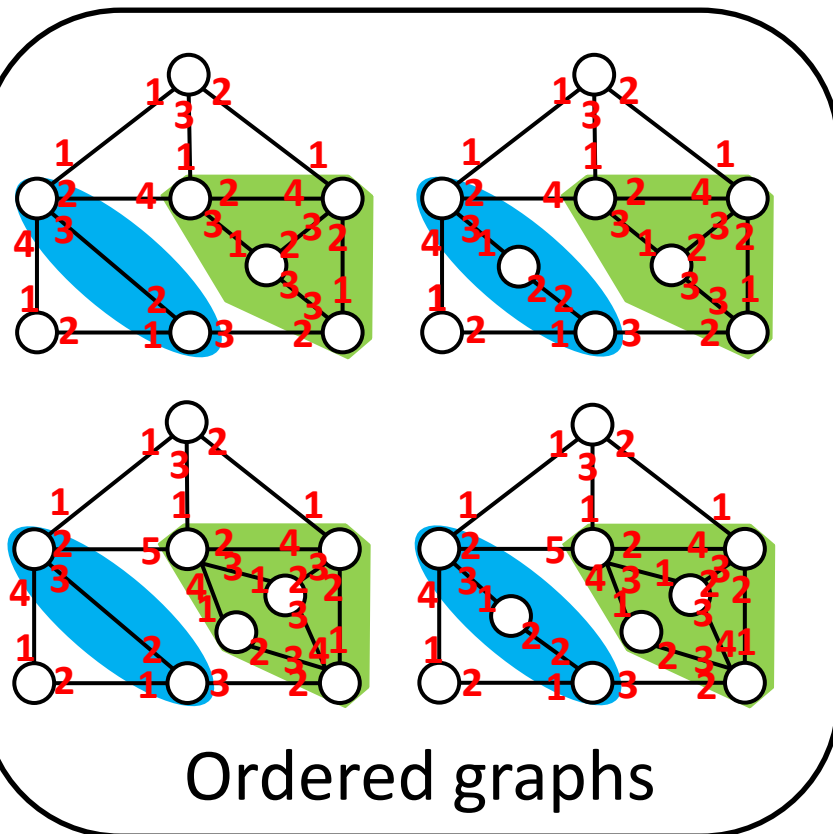
Ordered graph[Jiang and Bunke,1998]:  
Each vertex has a unique order based  
on neighboring vertices.



ordered graph

# Motivation

Purpose of this research is to discover characteristic ordered graph patterns common to ordered graphs.



# Our approach

## 1. **Ordered graph patterns** as Knowledge representation (**This paper**)

Ordered graph pattern has structural variables and each of whose vertices has an order on neighboring vertices and structural variables.

## 2. **Hypothesis checking process** for knowledge discovery (**This paper**)

We present an efficient matching algorithm to solve the following problem.

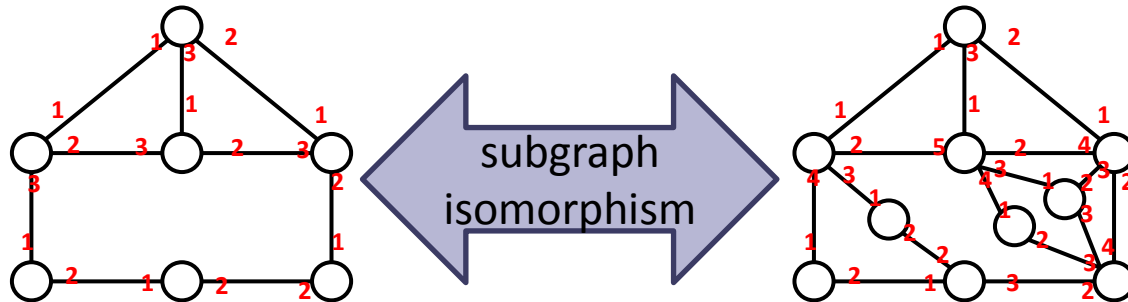
**Membership problem:**

Does an ordered graph pattern  $g$  represent an ordered graph  $G$ ?

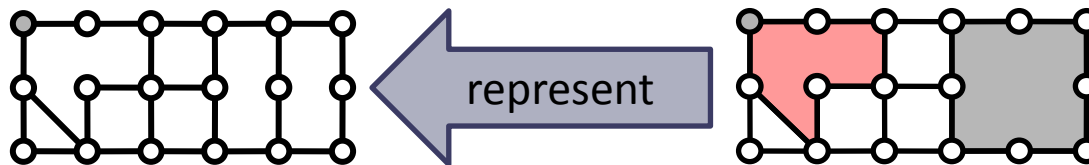
## 3. **Learning method** from ordered graphs e.g. Inductive inference from positive data

# Related works

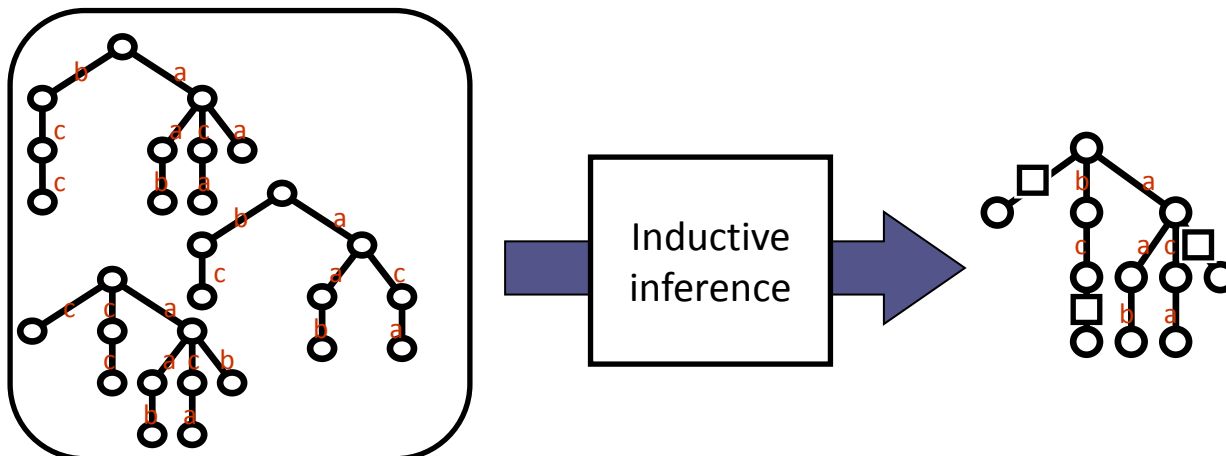
1. Ordered subgraph isomorphism[X. Jiang and H. Bunke,1998]



2. Matching algorithm for planar map[S. Kawamoto et al.,2010]



3. Inductive inference of ordered term tree[Y. Suzuki et al., 2006]

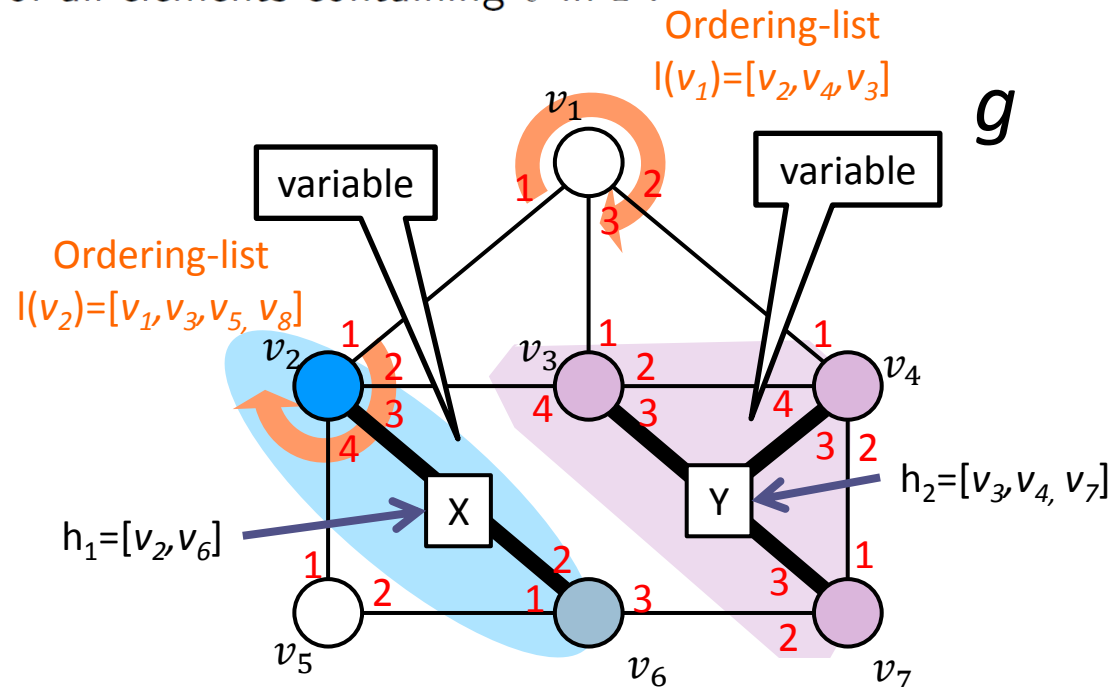


# 2.Preliminaries:

## Ordered graph pattern

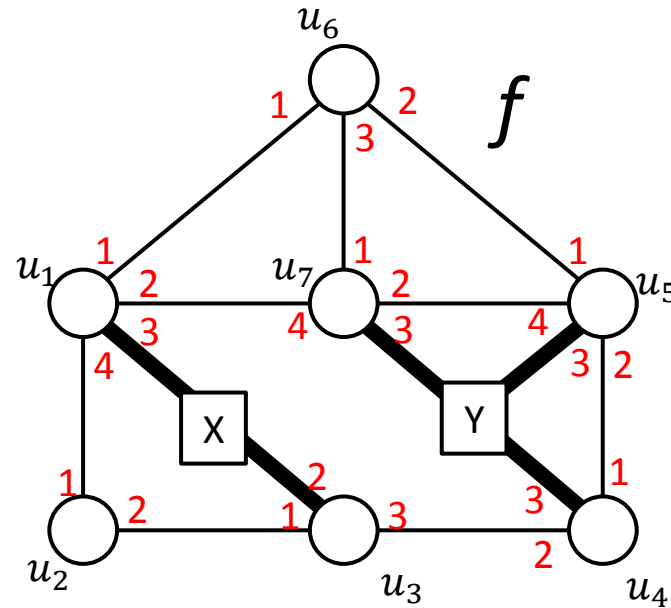
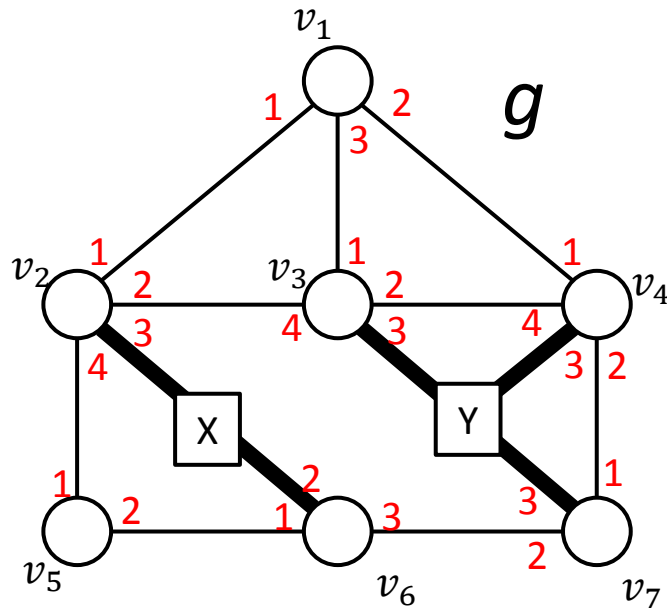
An ordered graph pattern is a five-tuple  $(V, E, H, F, \mathcal{L})$  defined as follows.

- (1)  $(V, E, H)$  is a graph pattern.
- (2)  $F$  is a multiset of elements in the set  $\{\{u, v\} \mid u \in V, v \in (V \cup H)\}$ , such that  $F \supseteq \{\{u, v\} \mid (u, a, v) \in E\}$  and the graph pattern  $(V, \{\{u, v\} \mid u, v \in V, \{u, v\} \in F\}, \emptyset)$  is connected. An element in  $F$  is called an ordering-edge.
- (3)  $\mathcal{L} = \{\ell_F(v) \mid v \in V\}$ , called an ordering-set, where  $\ell_F(v)$ , called an ordering-list of  $u$  on  $F$ , is a cyclic list of all elements containing  $v$  in  $F$ .



# Ordering isomorphic

An ordered graph pattern  $g$  is said to be ordering isomorphic to an ordered graph pattern  $f$  if there exists a bijection  $\varphi : V(g) \rightarrow V(f)$  satisfying the following three conditions. (1)  $(u, a, v) \in E(g)$  if and only if  $(\varphi(u), a, \varphi(v)) \in E(f)$ . (2)  $(u_0, x, u_1, \dots, u_k) \in H(g)$  if and only if  $(\varphi(u_0), x, \varphi(u_1), \dots, \varphi(u_k)) \in H(f)$ . (3)  $\ell_{F(g)}(v) = (v_1, \dots, v_k) \in \mathcal{L}(g)$  if and only if  $\ell_{F(f)}(\varphi(v)) = (\varphi(v_1), \dots, \varphi(v_k)) \in \mathcal{L}(f)$ , where for a variable  $(w_1, \dots, w_t) \in H(g)$ ,  $\varphi((w_1, \dots, w_t))$  is defined as  $(\varphi(w_1), \dots, \varphi(w_t))$ .



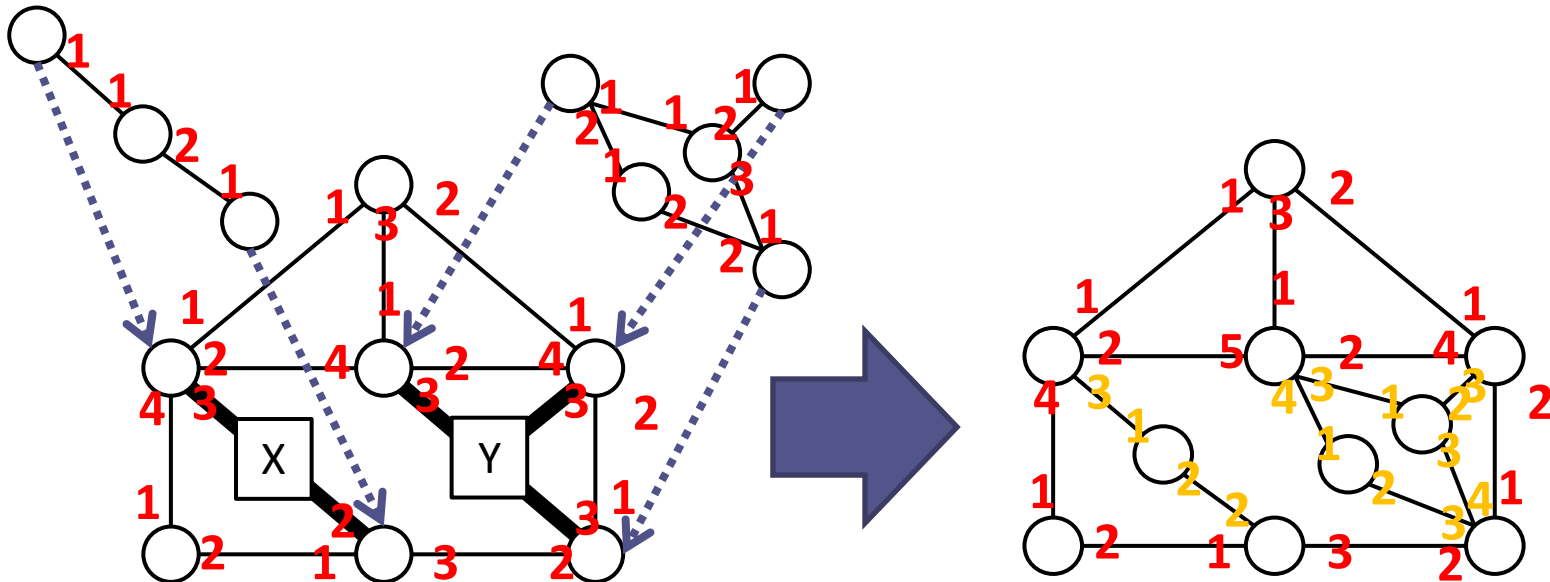
## Lemma 1

For two ordered graph patterns  $g$  and  $f$ , a problem of determining whether or not  $g$  is ordering isomorphic to  $f$  is solvable in  $O(\|\mathcal{L}(g)\|^2)$  time.

# Substitution for an ordered graph pattern

Replace a variable with an ordered graph in the following way.

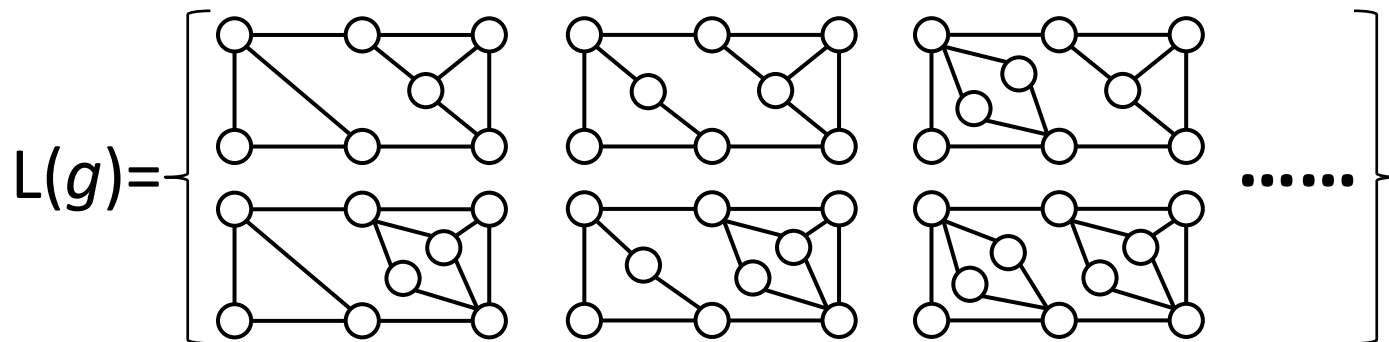
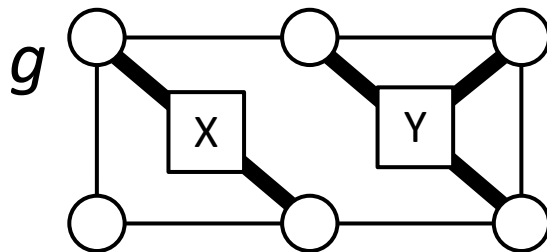
1. Remove the variable
2. Identify the port of variable with the vertices of ordered graph
3. Update ordering-list





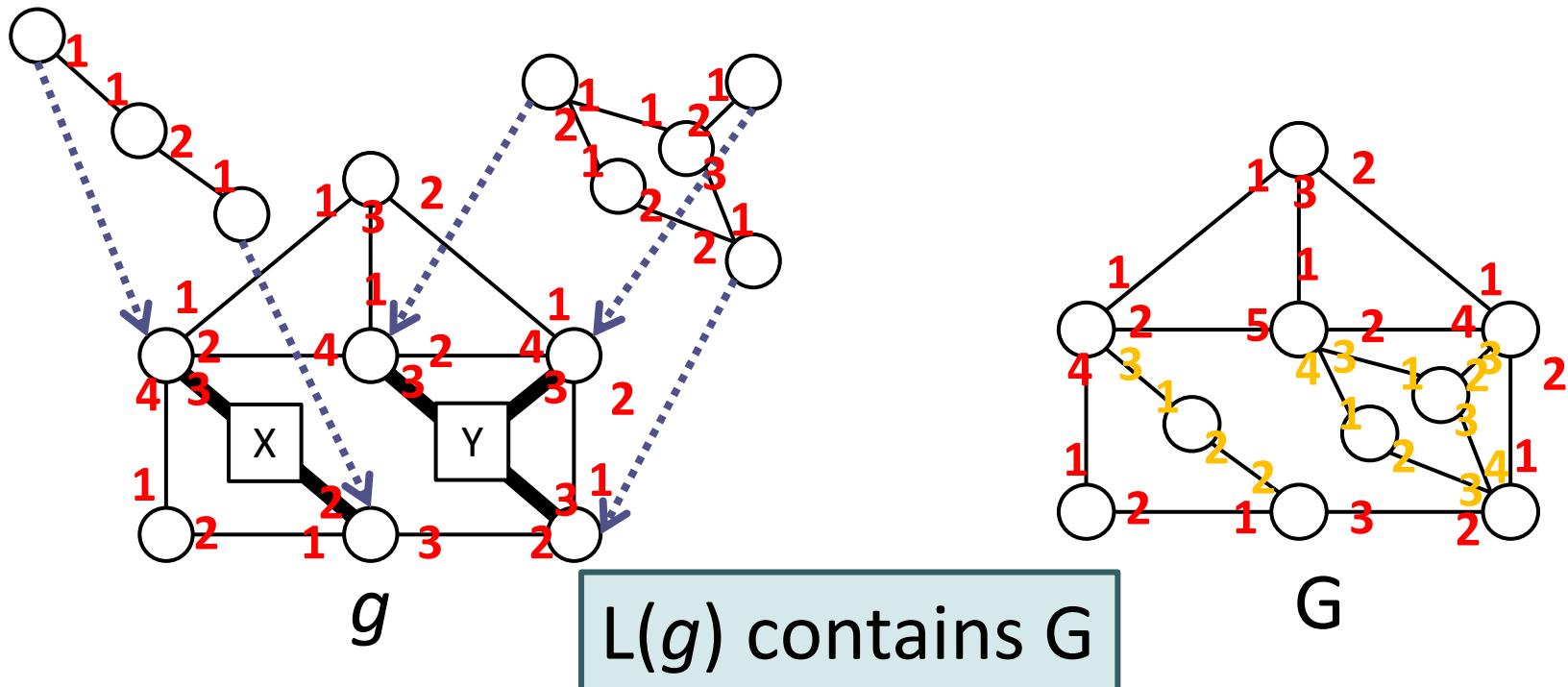
# Ordered graph pattern language

For an ordered graph pattern  $g$ , the ordered graph pattern language of  $g$ , denoted by  $L(g)$ , is defined as the set of all ordered graphs obtained from an ordered graph pattern by arbitrary substitutions.



### 3. Pattern matching algorithm for Membership problem for ordered graph patterns

Instance: An ordered graph  $G$  and an ordered graph pattern  $g$ .  
 problem: Does  $L(g)$  contain  $G$ ?



# Matching algorithm

Input: ordered graph  $G$ , ordered graph pattern  $g$ .  
begin

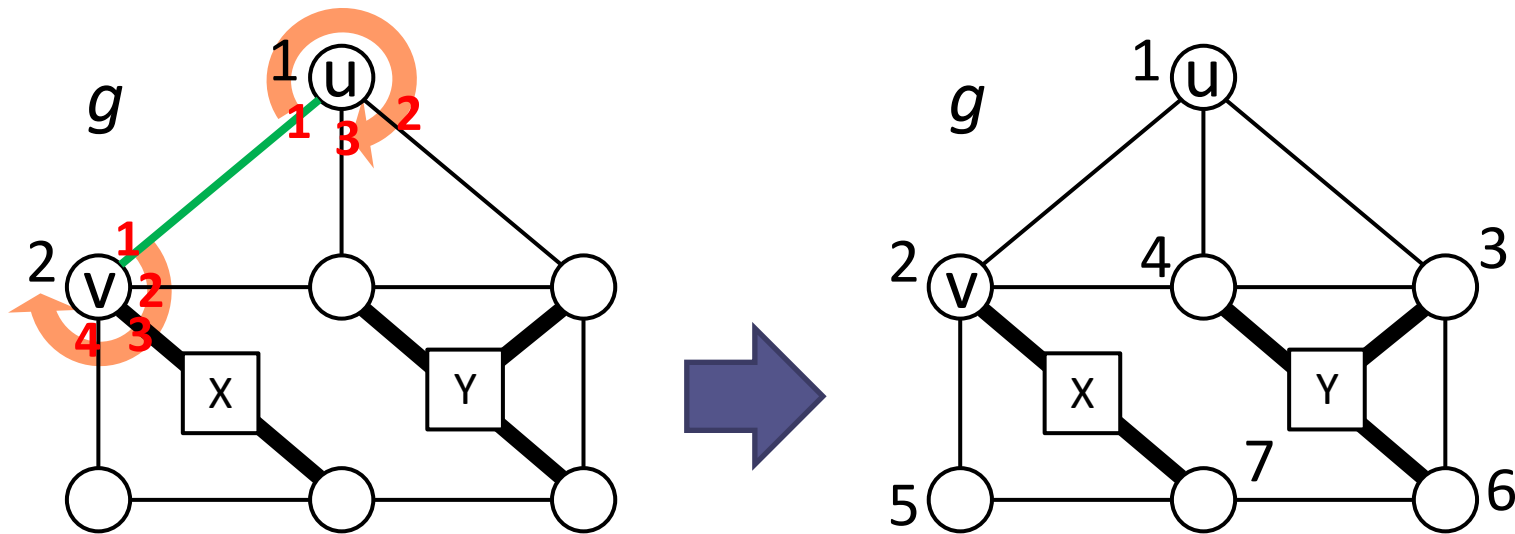
1. Let  $u$  be a vertex of  $g$  and  $\{u, v\}$  in cyclic list of  $u$ ;
  2.  $C := \text{Coding}(\{u, v\} g)$ ;
  3. for each  $w$  in  $V(G)$  do
  4.   foreach  $e$  in cyclic list of  $w$  do
  5.     if  $\text{CodeMatch}(C, e, G)$  and  $\text{StructureMatch}(C, g, G)$
  6.       then return true;
  7. return false
- end.

## Lemmas 2 and 3

For an ordered graph pattern  $g$  and an ordered graph  $G$ ,  $g$  and  $G$  match on code and on graph structure if and only if  $g$  matches  $G$ .

# Coding( $\{u,v\},g$ )

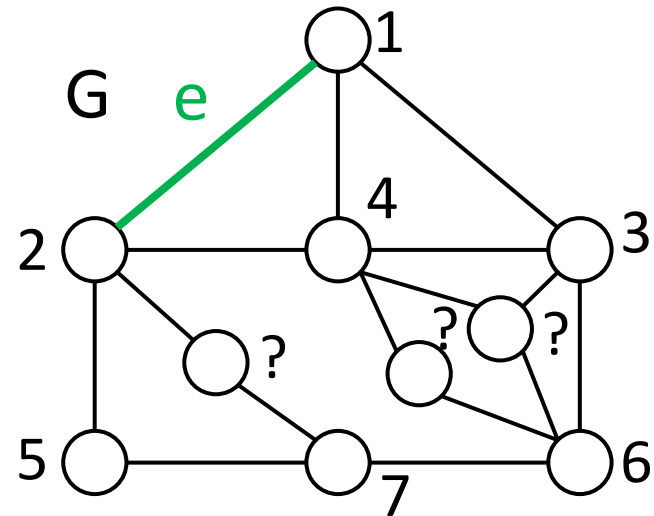
This procedure visits all vertices of the input ordered graph pattern  $g$  and attaches the ID of each vertex to the code of  $g$  by modifying polynomial time coding algorithm [X.Jiang and H.Bunke,1998] for ordered graphs.



$C=\#234\#14x5\#16y4\#13y2\#27\#37y\#5x6\#$

# CodeMatch(C,e,G)

The procedure checks whether or not the code of  $g$  matches a code of  $G$ .



$C = \# 234\#14x5\#16y4\#13y2\#27\#37y\#5x6\#$

$\text{Code}(G) = \#234\#14?5\#16?4\#13??2\#27\#37??\#5?6\#$



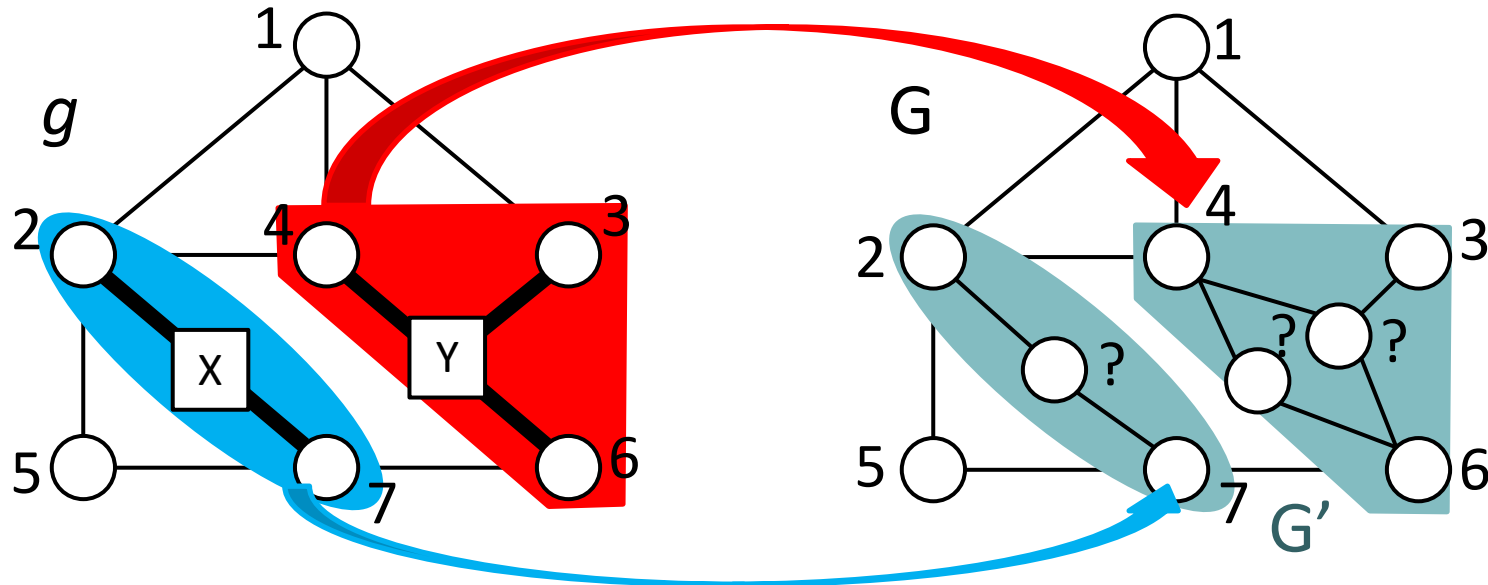
Replace  $?^+$  with x or y

$\text{Code}(G) = \#234\#14x5\#16y4\#13y2\#27\#37y\#5x6\#$

$C = \text{Code}(G) \Rightarrow \text{CodeMatch}(C,e,G)$  returns yes

# StructureMatch( $C, g, G$ )

The procedure StructureMatch determines whether or not  $g$  and  $G$  match on graph structure.



For an ordered graph pattern  $g$  and an ordered graph  $G$  such that  $g$  and  $G$  match on code, we say that  $g$  and  $G$  *match on graph structure* if the following conditions hold. Let  $\varphi : V(g) \rightarrow V(G)$  be a one-to-one mapping obtained by  $\text{CODING}(e, g, \emptyset)$ .

- (1) For each variable  $(u_0, x, u_1, \dots, u_k) \in H(g)$ , all vertices  $\varphi(u_1), \varphi(u_1), \dots, \varphi(u_k)$  in  $V(G)$  are in the same component of  $G'$ .
- (2) For any two distinct variables  $(u_0, x, u_1, \dots, u_k), (v_0, x, v_1, \dots, v_k) \in H(g)$  having the same variable label  $x$ , the component in  $G'$  having  $\varphi(u_0), \varphi(u_1), \dots, \varphi(u_k)$  is ordering isomorphic to the component in  $G'$  having  $\varphi(v_0), \varphi(v_1), \dots, \varphi(v_k)$ .

# Main Theorem

## Theorem 1

For an ordered graph pattern  $g$  and on ordered graph  $G$ , the membership problem for  $g$  and  $G$  is solvable in polynomial time.

The total time of the algorithm is  $O(|V(g)| \times \|\mathcal{L}(G)\|^2)$ .

$|V(g)|$ : The number of vertices of ordered graph pattern  $g$ .

$\|\mathcal{L}(G)\|$ : The number of ordering-edges of ordered graph  $G$ .

# Conclusion

1. We have proposed an ordered graph pattern as a new graph pattern.
2. We have proposed a polynomial time matching algorithm to solve the membership problem for ordered graph patterns.



# Future Work (1)

1. It can be shown that the class of ordered graph pattern languages is **polynomial time inductively inferable** from positive data by showing the following three propositions.
  1. The class of ordered graph pattern languages has finite thickness. --- obviously hold
  2. **The membership problem** of ordered graph pattern languages is solvable in polynomial time. --- showed in this paper.
  3. **The minimal language problem** of ordered graph pattern languages is solvable in polynomial time. --- future work

# Future Work (2)

2. For graph structured data such as Web pages, TEX files, CAD, MAP, we are designing a **graph mining tools** having the following knowledge representations.

1. **Ordered graph pattern** representing graph structures common to graph structured data. --- this work

We are implementing a graph mining tools having an ordered graph pattern as a knowledge representation.

2. **Layout Formal Graph System** [Uchida et al., 2000] which is a first-order logic programming system dealing with ordered graph pattern as a term.

----- Extension of this presentation

