

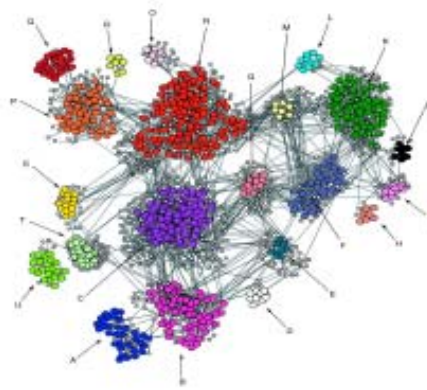
# Subgraph Isomorphic Algorithms

제8회 소프트웨어무결점연구센터 워크숍

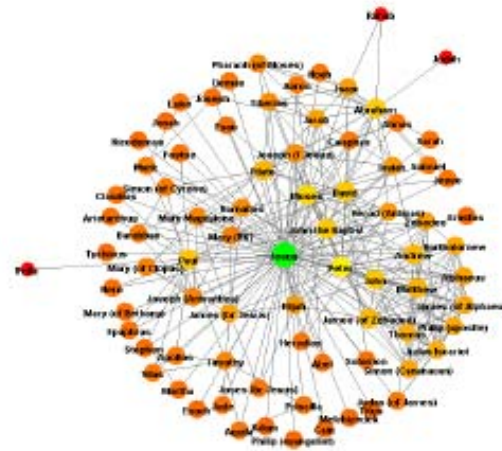
경북대학교 데이터베이스 연구실  
이진수

# Graphs are Everywhere

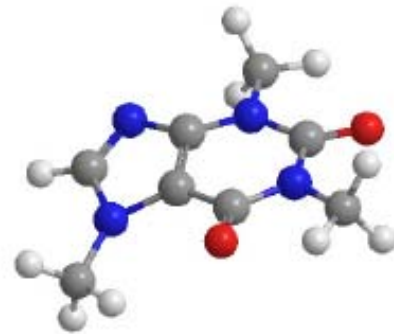
Magwene et al. *Genome Biology* 2004 5:R100



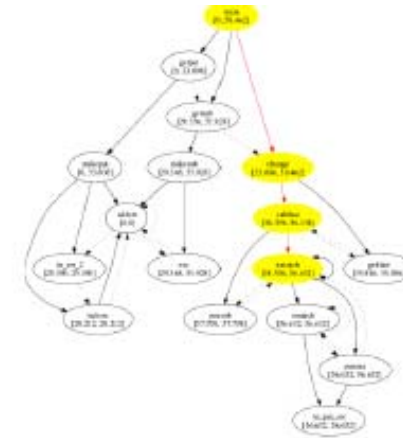
Co-expression Network



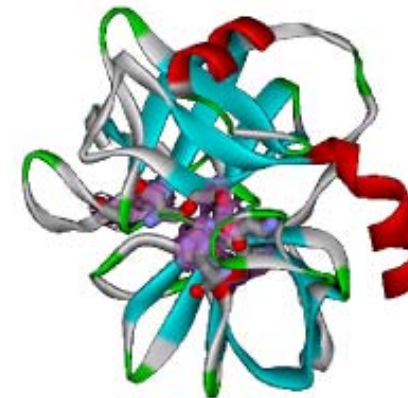
Social Network



Chemical Compound



Program Flow

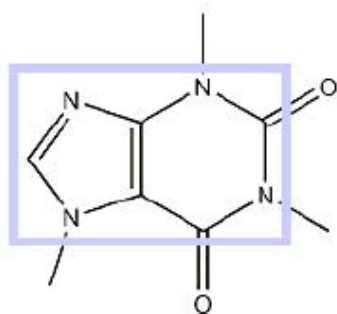


Protein Structure

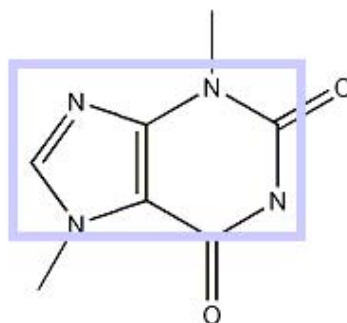
(c) Copyright by Han, Yan, Yu 2006

# Example 1: Frequent Subgraphs

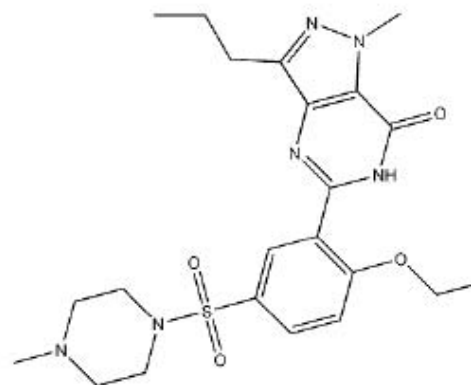
## CHEMICAL COMPOUNDS



(a) caffeine



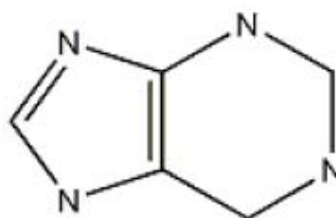
(b) diurobromine



(c) viagra

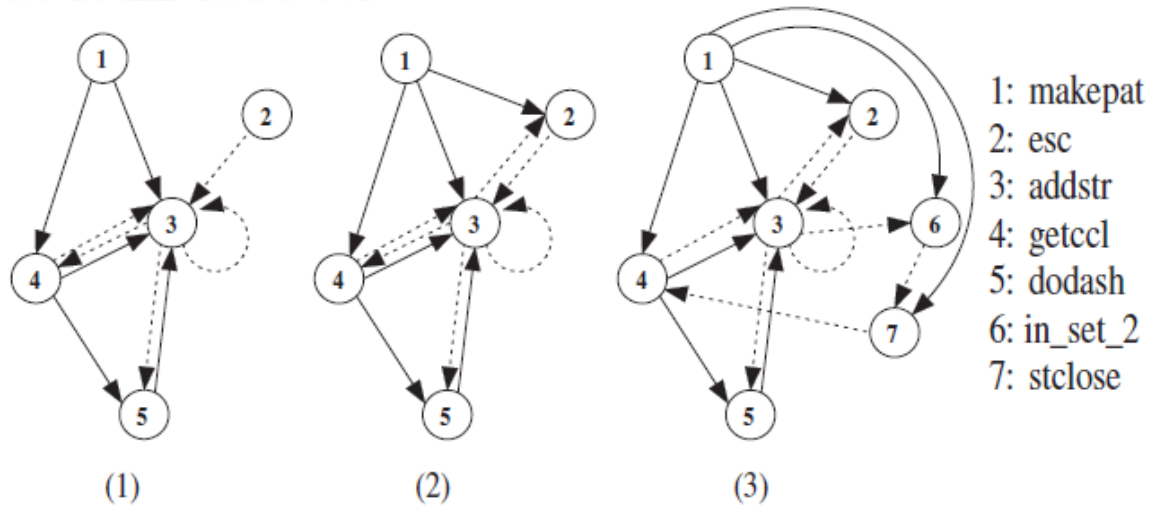
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## FREQUENT SUBGRAPH

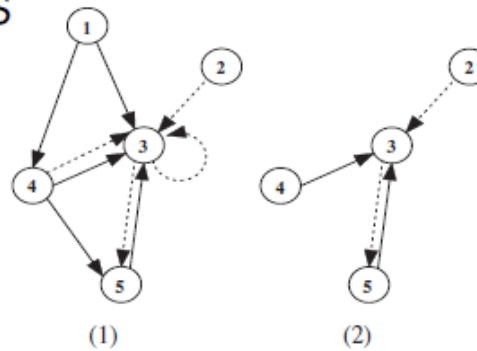


# Example 2: Frequent Subgraphs

## PROGRAM CALL GRAPHS

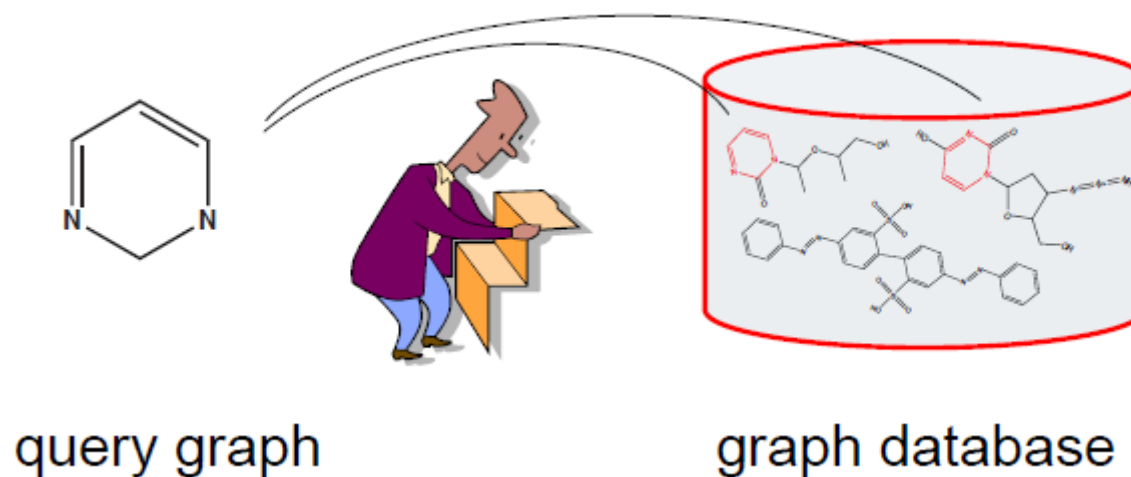


## FREQUENT SUBGRAPHS (MIN SUPPORT IS 2)



# Graph Searching

- ▶ Find all of the graphs in a database that contain the query graph



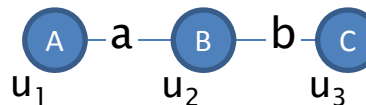


# Problem Definition: Subgraph Isomorphism

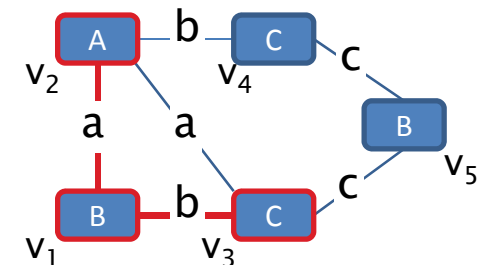
- ▶ Graph  $g = \{V, E, \Sigma, L\}$ 
  - $V(g)$ : a set of vertices
  - $E(g)$ : a set of edges,  $E(g) \subseteq V(g) \times V(g)$
  - $\Sigma$ : a set of all labels
  - $L$ : labeling function,  $L(v) \in \Sigma$  and  $L(e) \in \Sigma$  ( $v \in V(g)$ ,  $e \in E(g)$ )
- ▶ Query graph  $q$  is **subgraph-isomorphic** to data graph  $g$ , if there is an **injective function**  $M : V(q) \rightarrow V(g)$ , such that :

1.  $\forall u \in V(q) : L(u) \subseteq L(M(u))$
2.  $\forall (u, u') \in E(q) : (M(u), M(u')) \in E(g)$
3.  $\forall (u, u') \in E(q) : L(u, u') = L(M(u), M(u'))$

query graph  $q$



data graph  $g$



# Existing Subgraph Isomorphic Algorithms

- ▶ Popular algorithms:
  - Ullman's algorithm, ACM Journal, 1976
  - VF2 algorithm, Trans. on Patt. Analysis and Machine Intel., 2004
  
- ▶ Recently published algorithms:
  - GraphQL algorithm, SIGMOD 2008
  - QuickSI algorithm, PVLDB 2008
  - GADDI algorithm, EDBT 2009
  - SPath algorithm, VLDB 2010

# General Search Algorithm

- ▶ 기존 검색 알고리즘을 일반화하여 표현
- ▶ 주요 서브 루틴
  - FilterCandidates
    - 각 query vertex와 matching이 될 수 있는 candidate data vertex set을 검색
  - NextQueryVertex
    - Matching을 찾을 다음 query vertex를 선택
  - RefineCandidates
    - 검색 상태 정보를 사용하여 candidate set을 refine
  - IsJoinable
    - Matching된 data vertex가 유용한 matching인지를 검사

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## Algorithm 1 GENERICQUERYPROC

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**Input:** query graph  $q$

**Input:** data graph  $g$

**Output:** all subgraph isomorphisms of  $q$  in  $g$

```

1:  $M := \emptyset$ ;
2: for each  $u \in V(q)$  do
3:    $C(u) := \text{FILTERCANDIDATES}(q, g, u, \dots)$ ;
    $[[ \forall v \in C(u) ((v \in V(g)) \wedge (L(u) \subseteq L(v))) ]]$ 
4:   if  $C(u) = \emptyset$  then
5:     return;
6: SUBGRAPHSEARCH( $q, g, M, \dots$ );
    
```

### Subroutine SUBGRAPHSEARCH( $q, g, M, \dots$ )

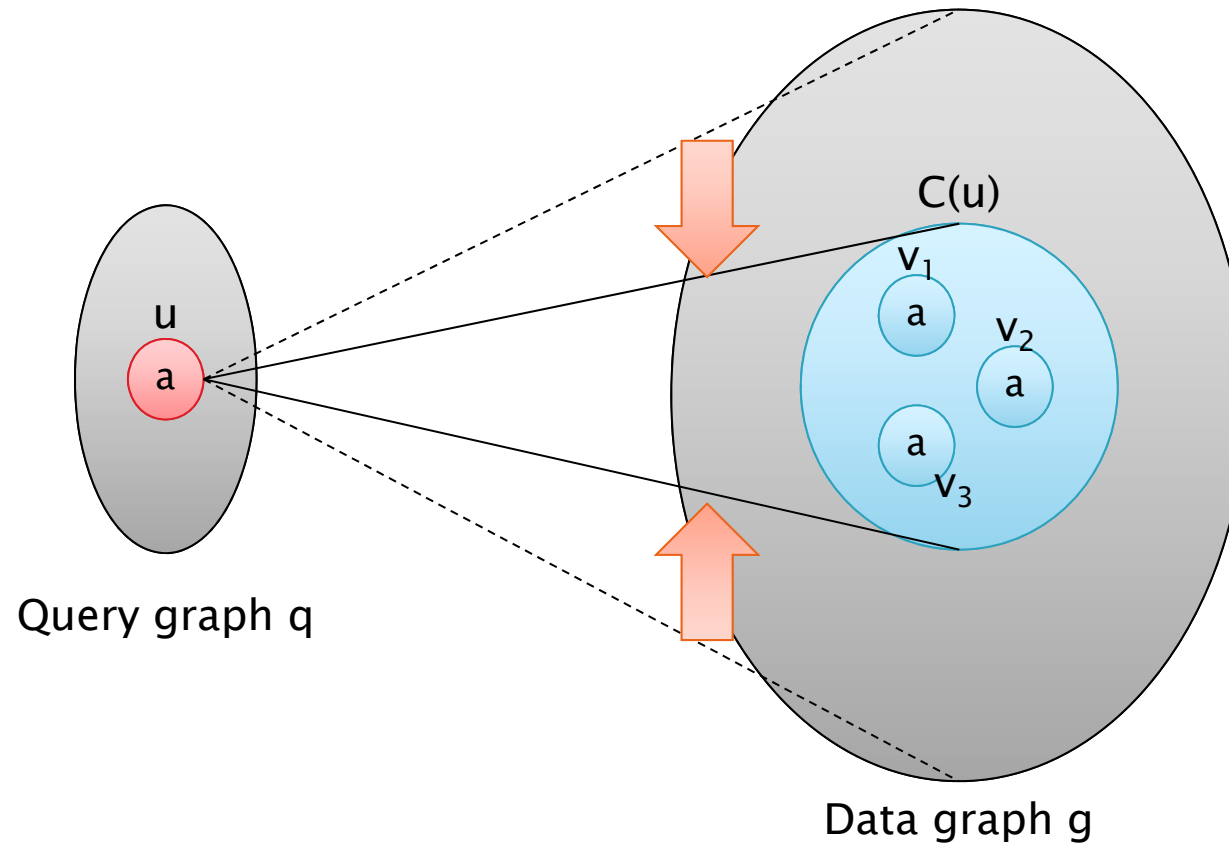
```

1: if  $|M| = |V(q)|$  then
2:   report  $M$ ;
3: else
4:    $u := \text{NEXTQUERYVERTEX}(\dots)$ ;
    $[[ u \in V(q) \wedge \forall (u', v) \in M (u' \neq u) ]]$ 
5:    $C_R := \text{REFINECANDIDATES}(M, u, C(u), \dots)$ ;
    $[[ C_R \subseteq C(u) ]]$ 
6:   for each  $v \in C_R$  such that  $v$  is not yet matched do
7:     if  $\text{ISJOINABLE}(q, g, M, u, v, \dots)$  then
8:        $[[ \forall (u', v') \in M ((u, u') \in E(q) \implies$ 
          $(v, v') \in E(g) \wedge L(u, u') = L(v, v')) ]]$ 
9:       UPDATESTATE( $M, u, v, \dots$ );
          $[[ (u, v) \in M ]]$ 
10:      SUBGRAPHSEARCH( $q, g, M, \dots$ );
11:      RESTORESTATE( $M, u, v, \dots$ );
          $[[ (u, v) \notin M ]]$ 
    
```

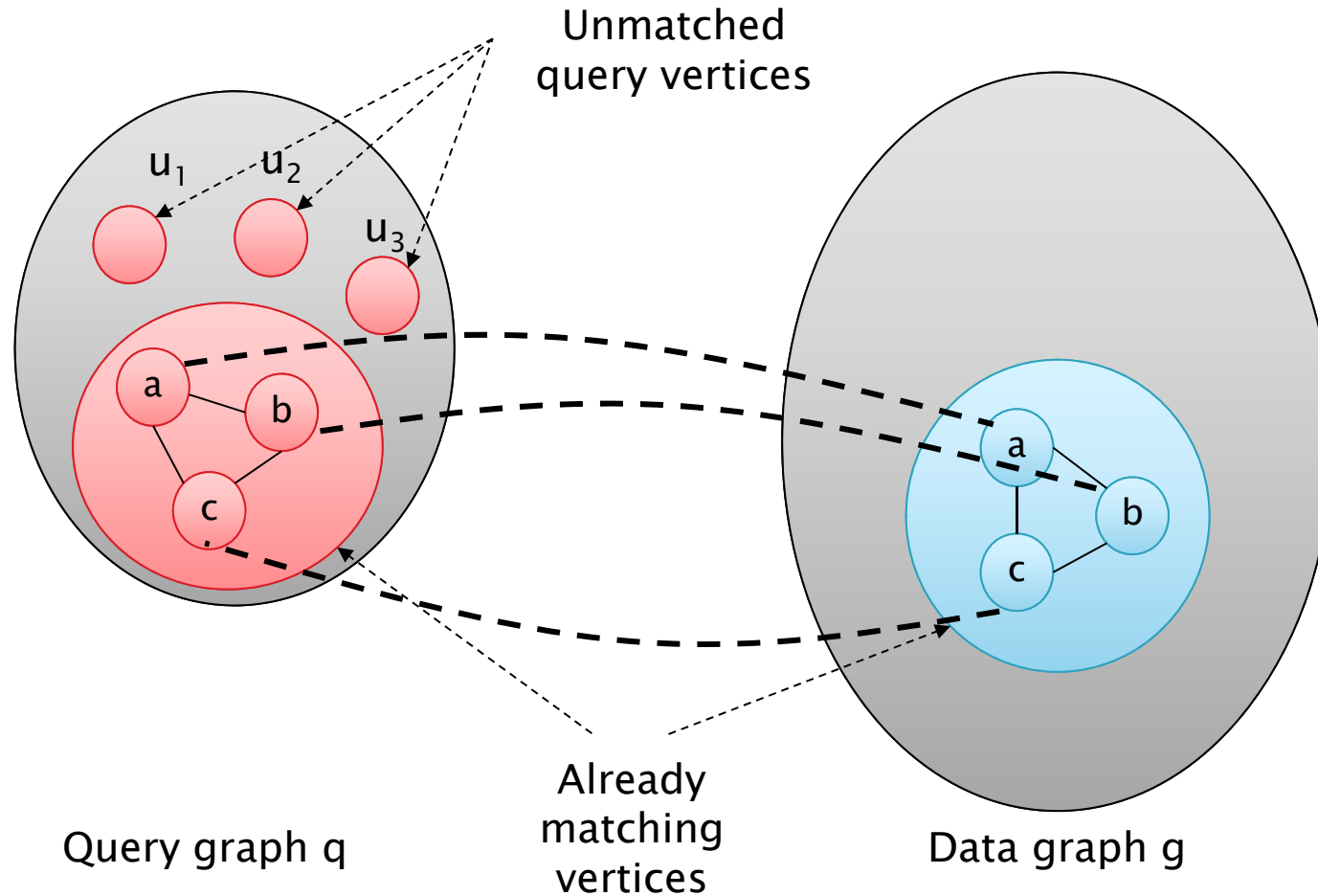
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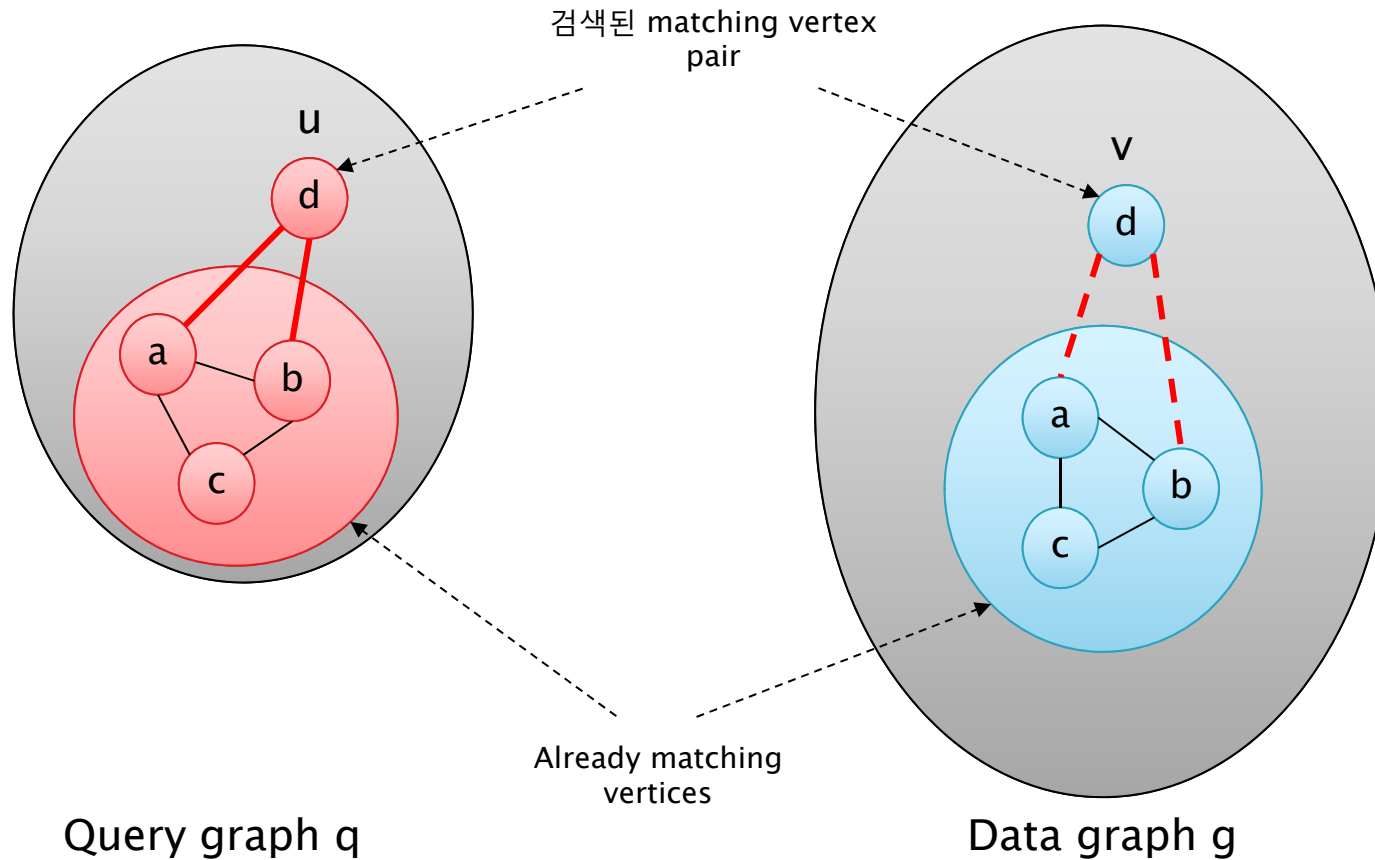
# Filtering Candidates



# Selecting Next Query Vertex



# Joinable Test



# Ullman's Algorithm

- ▶ NextQueryVertex
  - 매칭 되지 않은 query vertex들 중에서 random하게 선택
- ▶ RefineCandidate
  - Vertex의 degree정보를 활용
  - $\text{Deg}(u) \leq \text{Deg}(v)$  ( $u \in V(q)$ ,  $v \in C(u)$ )를 만족하지 않는 data graph vertex  $v$ 를  $u$ 의 candidate set  $C(u)$ 에서 제거

# GraphQL Algorithm

## ▶ FilterCandidates

- Vertex의 neighborhood정보를 활용하여 filtering 효과를 높임
- 모든 vertex의 neighborhood vertex들에 나타난 label의 빈도수를 활용

## ▶ NextQueryVertex

- $|C(u)|$ 의 크기가 작은 순으로 query graph vertex를 선택함
- RDBMS의 heuristic join order selection과 유사한 방법으로 search space의 크기를 줄이는 효과를 가짐



# Thank You