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Special acknowledgement to School of Computing, National University of Singapore  
for allowing Steven to prepare and distribute these teaching materials.



# CS3233

# Competitive Programming

Dr. Steven Halim




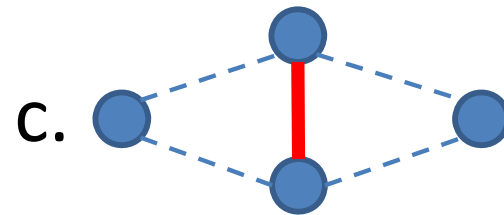
# Outline


- Mini Contest #6 + Break + Discussion + Admins
- Graph Matching
  - Overview
  - Unweighted MCBM: Max Flow, Augmenting Path, Hopcroft Karp's
    - Relevant Applications: Bipartite Matching (with Capacity),  
Max Independent Set, Min Vertex Cover, Min Path Cover on DAG
  - Weighted MCBM: Min Cost Max Flow (overview only)
  - Unweighted MCM: Edmonds's Matching
  - Weighted MCM: DP with Bitmask (only for small graph)

# Graph Matching

- A matching (**marriage**) in a graph  $G$  (**real life**) is a subset of edges in  $G$  (**special relationships**) such that no two of which meet at a common vertex (**that is, no affair!**)

- Thus a.  b.  are matchings (red thick edge),





- But d.  is not since there is an overlapping vertex

# Max Cardinality Matching (MCM)

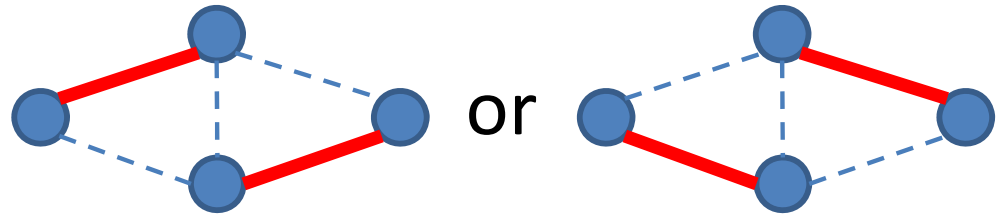
- Usually, the problem asked in graph matching is the size (cardinality) of a maximum matching
- A maximum matching is a matching that contains the largest possible number of edges

# Examples

-  is a maximum matching (0 matching)  
(no edge to be matched)
-  is also a maximum matching (1 matching)  
(no other edges to be matched)

- But  is not a maximum matching

as we can change it to  
(2 matchings)



# Types of Graph Matching

Other Attribute:  
**Perfect Matching**

**EASIER**

Yes

No

Bipartite?

**EASIER**

No

Yes

Weighted?

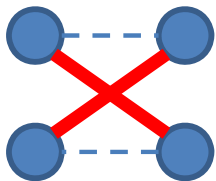
No

Yes

Weighted?

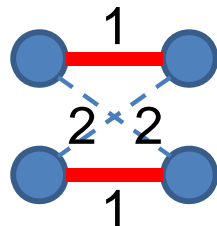
Unweighted MCBM

- Max Flow
- Augmenting Path
- Hopcroft Karp's



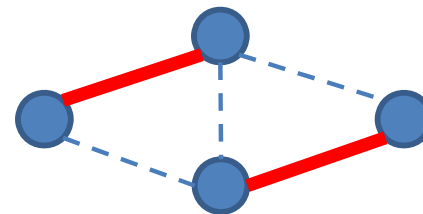
Weighted MCBM

- Min Cost Max Flow



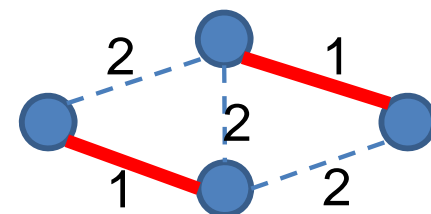
Unweighted MCM

- Edmonds's Matching

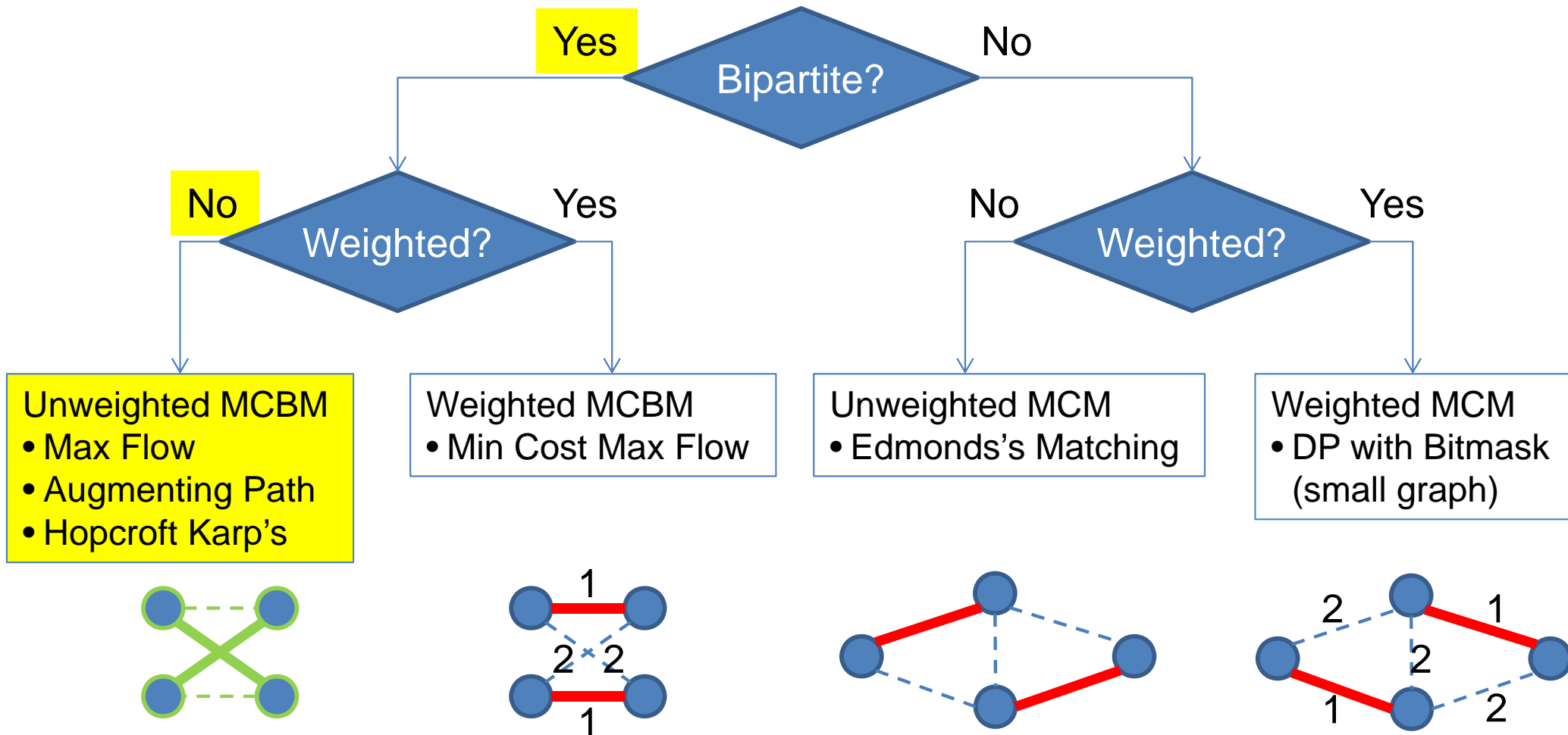


Weighted MCM

- DP with Bitmask (small graph)



# Types of Graph Matching



Solutions:

Max Flow

Augmenting Path Algorithm

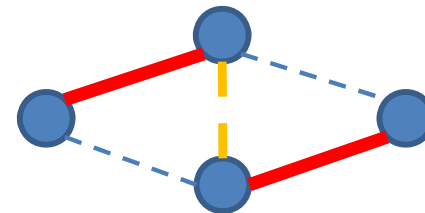
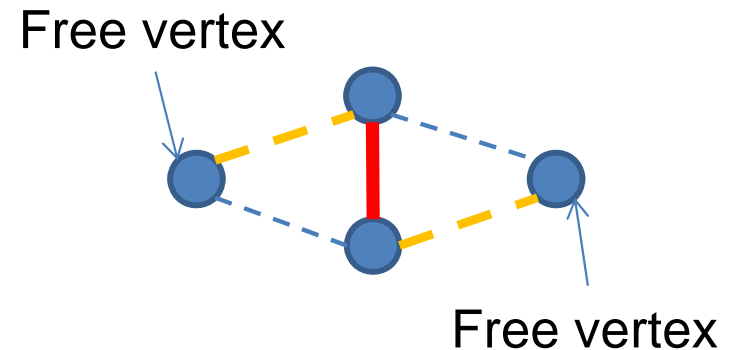
Hopcroft Karp's Algorithm

# **UNWEIGHTED MCBM**



# Augmenting Path

- In this graph, the path colored **orange(unmatched)-red(matched)-orange** is an augmenting path
- We can flip the edge status to **red-orange-red** and the number of edges in the matching set increases by 1



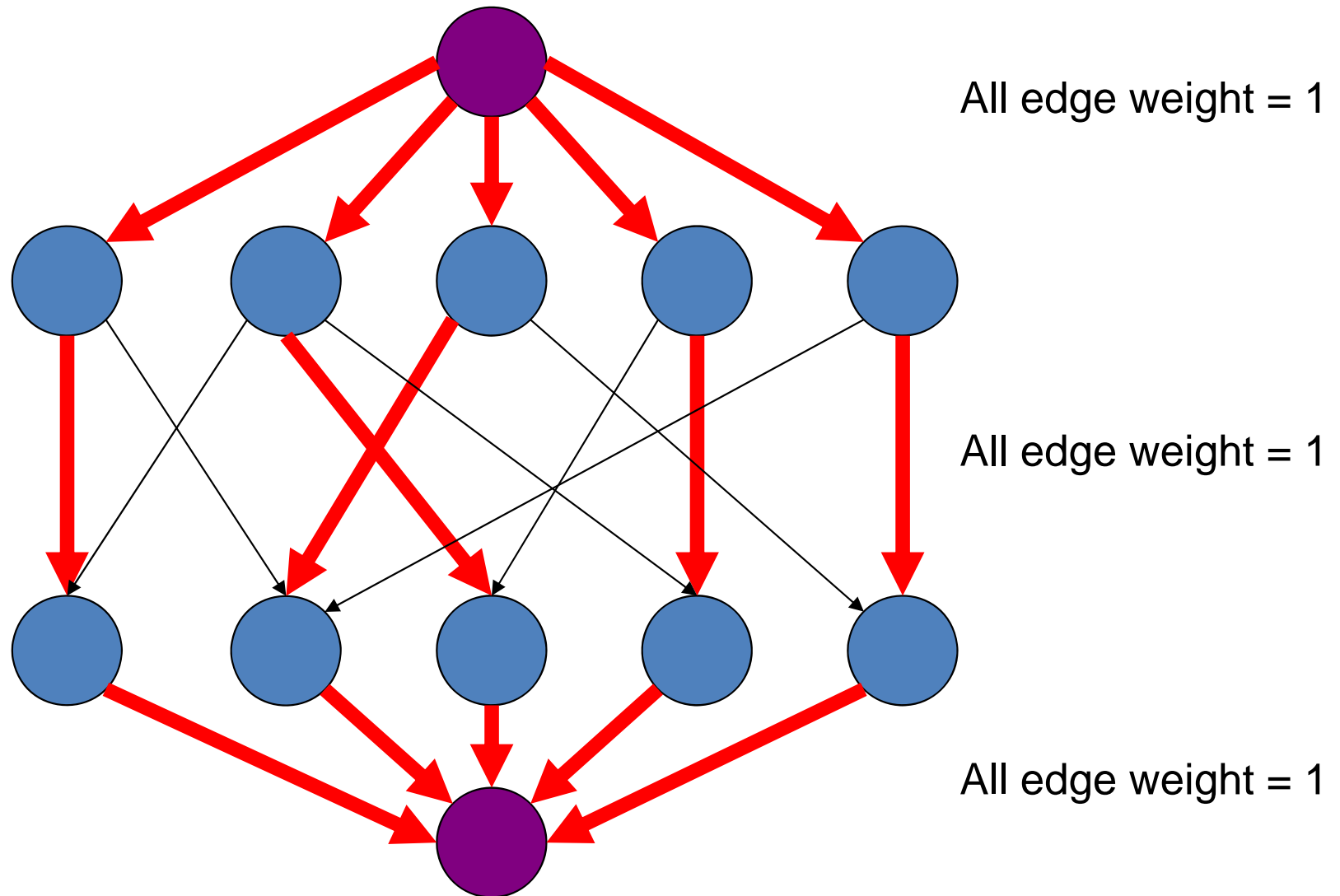
# MC **Bipartite** Matching (MCBM)

- A Bipartite graph is a graph whose vertices can be divided into two disjoint sets  $X$  and  $Y$  such that every edge can only connect a vertex in  $X$  to one in  $Y$
- Matching in this kind of graph is **a lot easier** than matching in general graph

Finding MCBM by reducing this problem into

# **MAX FLOW**

# Max Flow Solution for MCBM



Time Complexity: Depends on the chosen Max Flow algorithm

Finding MCBM via

# **AUGMENTING PATH ALGORITHM**

# Augmenting Path Algorithm

- Lemma (Claude Berge 1957):

A matching  $M$  in  $G$  is maximum  
iff there is no more augmenting path in  $G$

- Augmenting Path Algorithm is a simple  
 $O(V \cdot (V+E)) = O(V^2 + VE) \sim O(VE)$   
implementation of that lemma

# The Code (1) 😊

```
vi match, vis; // global variables

int Aug(int l) { // return 1 if ∃ an augmenting path
    if (vis[l]) return 0; // return 0 otherwise
    vis[l] = 1;
    for (int j = 0; j < (int)AdjList[l].size(); j++) {
        int r = AdjList[l][j].first;
        if (match[r] == -1 || Aug(match[r])) {
            match[r] = l;
            return 1; // found 1 matching
        }
    }
    return 0; // no matching
}
```

# The Code (2) 😊

```
// in int main(), build the bipartite graph
// only directed edge from left set to right set is needed

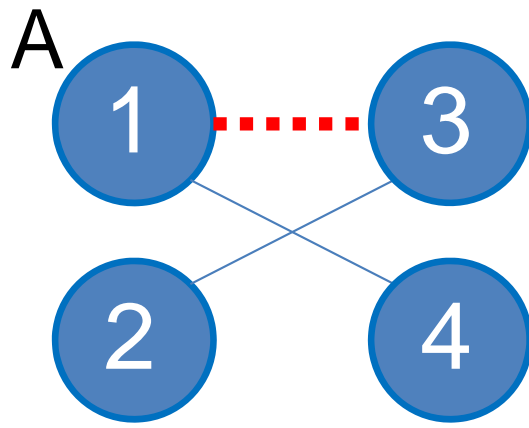
int MCBM = 0;
match.assign(V, -1);

for (int l = 0; l < Vleft; l++) {
    vis.assign(Vleft, 0);
    MCBM += Aug(l);
}

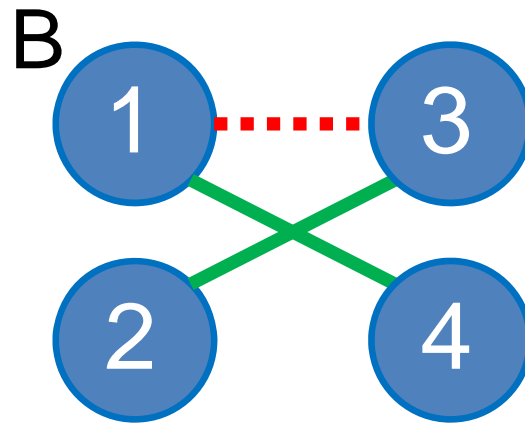
printf("Found %d matchings\n", MCBM);
```



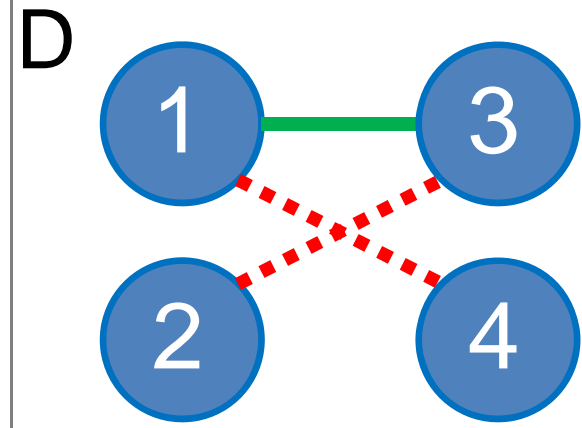
# Augmenting Path Algorithm



Easy Assignment  
1 matching (dotted line)



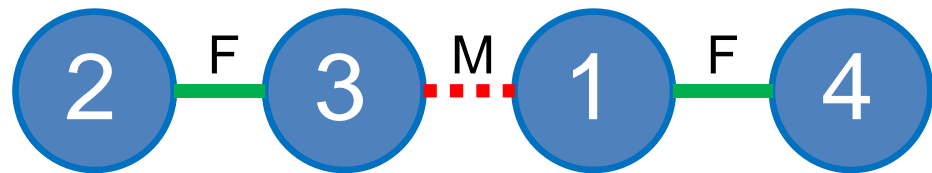
Augmenting Path  
2-3-1-4



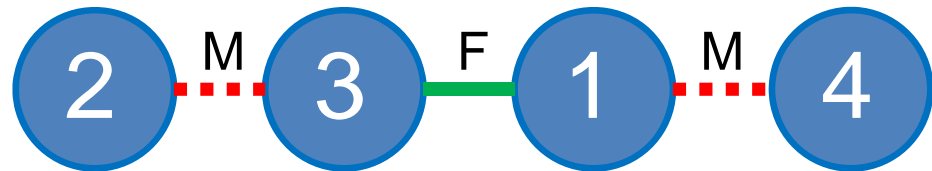
After Flip  
2 matchings (dotted lines)

C

An augmenting path  
F=Free, M=Matched



Flip to increase matching  
from 1 to 2 matchings

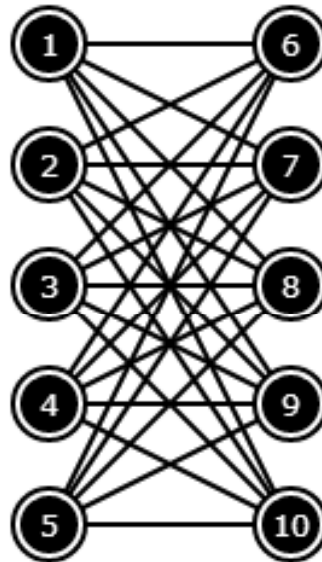


Finding MCBM via

# **HOPCROFT KARP'S ALGORITHM**

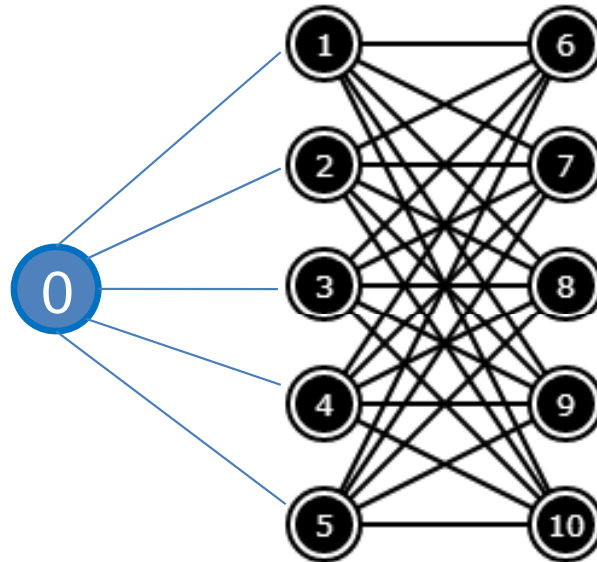
# An Extreme Test Case...

- A Complete Bipartite Graph  $K_{n,m}$ ,  $V=n+m$  &  $E = n*m$
- Augmenting Path algorithm  $\rightarrow O((n+m)*n*m)$ 
  - If  $m = n$ , we have an  $O(n^3)$  solution, OK for  $n \leq 200$
- Example with  $n = m = 5$



# Hopcroft Karp's Algorithm (1973)

- Key Idea:
  - Find the shortest augmenting paths first from all free vertices (with BFS)
  - Run similar algorithm as the Augmenting Path Algorithm earlier (DFS), but now using this BFS information



# Hopcroft Karp's Algorithm (1973)

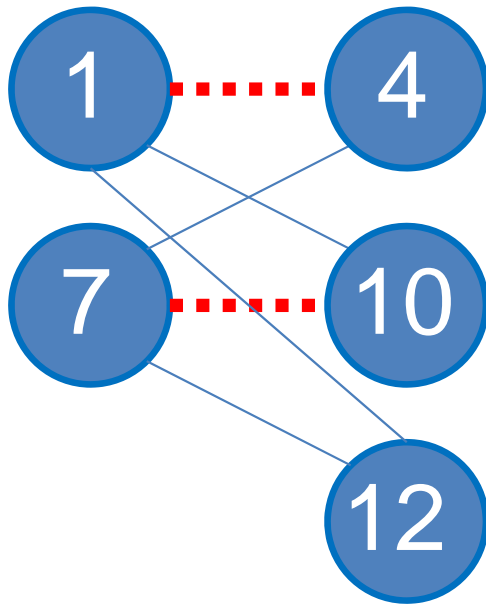
- Hopcroft Karp's runs in  $O(E\sqrt{V})$ , proof omitted
  - For the extreme test case in previous slide, this is  $O(n*m*\sqrt{n+m})$
  - With  $m = n$ , this is about  $O(n^{5/2})$ , OK for  $n \leq 600$
- Question: Is this algorithm **must be learned** in order to do well in programming contest?



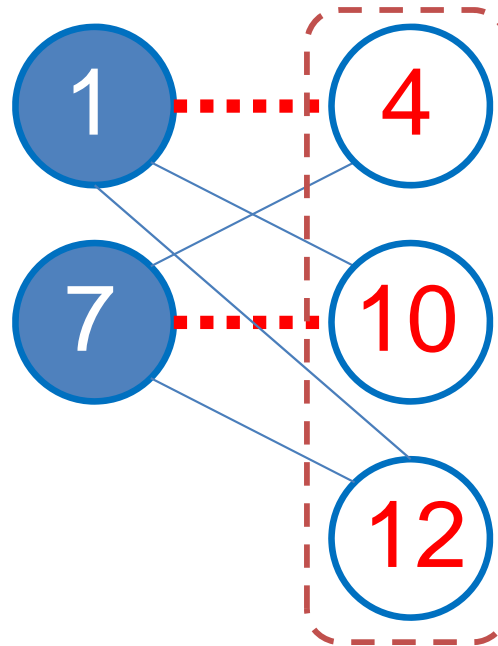
# **EXAMPLES OF MCBM IN PROGRAMMING CONTESTS**

# Popular Variants

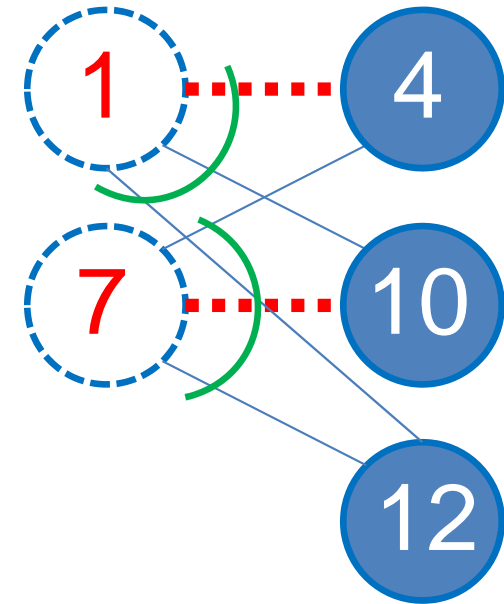
## Max Independent Set / Min Vertex Cover



A. MCBM



B. Max Independent Set  
 $MIS: V - MCBM$

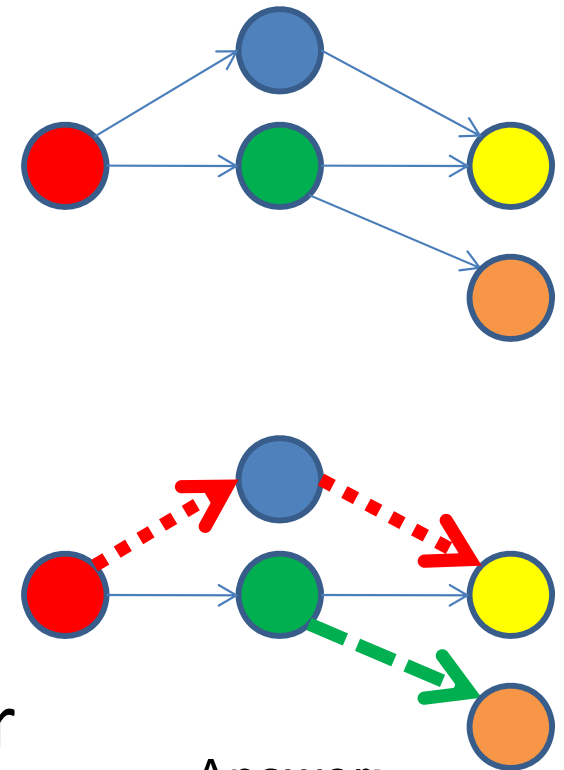


C. Min Vertex Cover  
 $MVC: MCBM$

**(König's theorem)**

# Min Path Cover in DAG

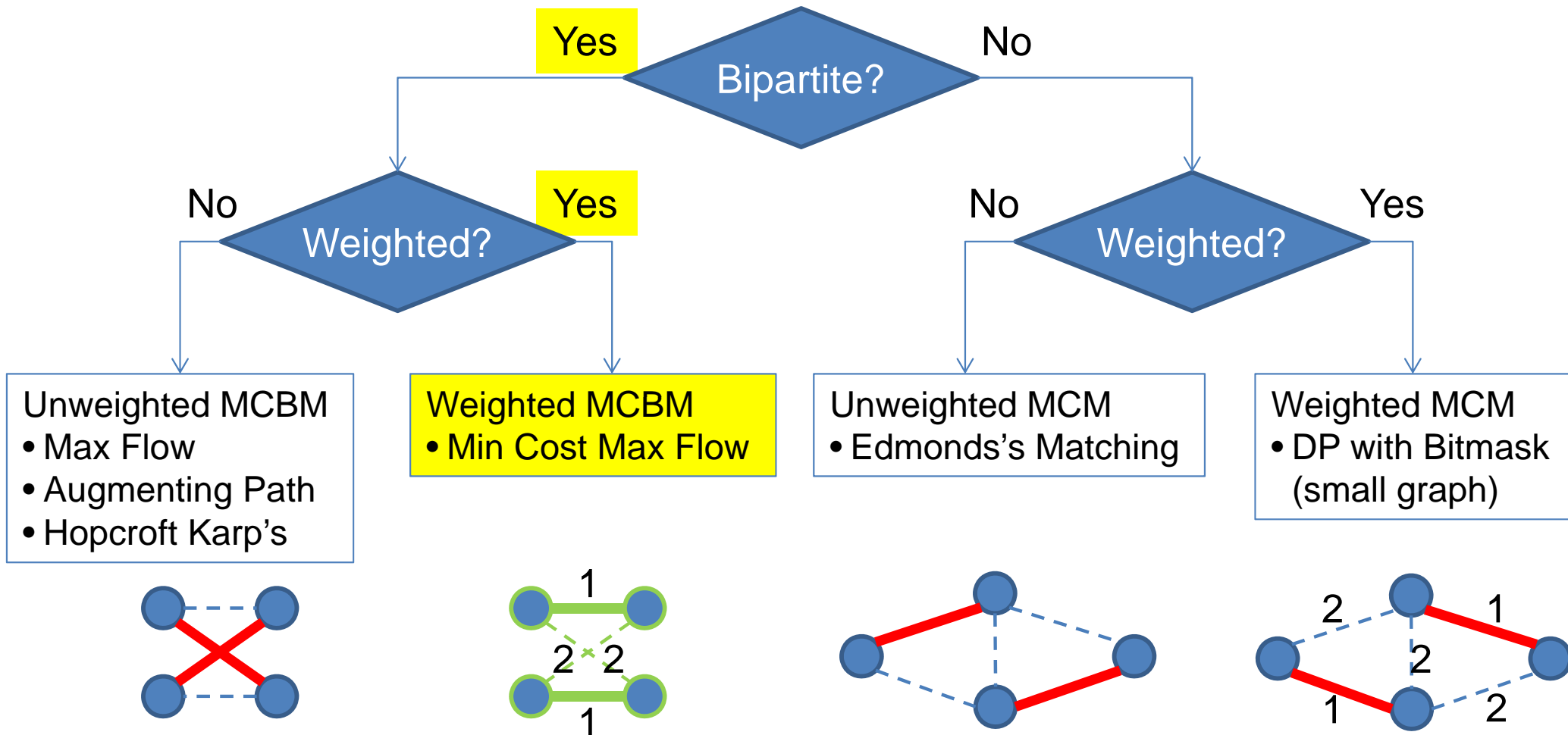
- Illustration:
  - Imagine that vertices are passengers, and draw edge between two vertices if a single taxi can satisfy the demand of both passengers on time...
  - What is the minimum number of taxis that must be deployed to serve all passengers?
- This problem is called: Min Path Cover
  - Set of directed paths s.t. every vertex in the graph belong to at least one path (including path of length 0, i.e. a single vertex)



Answer:  
2 Taxis!



# Types of Graph Matching



Solution:

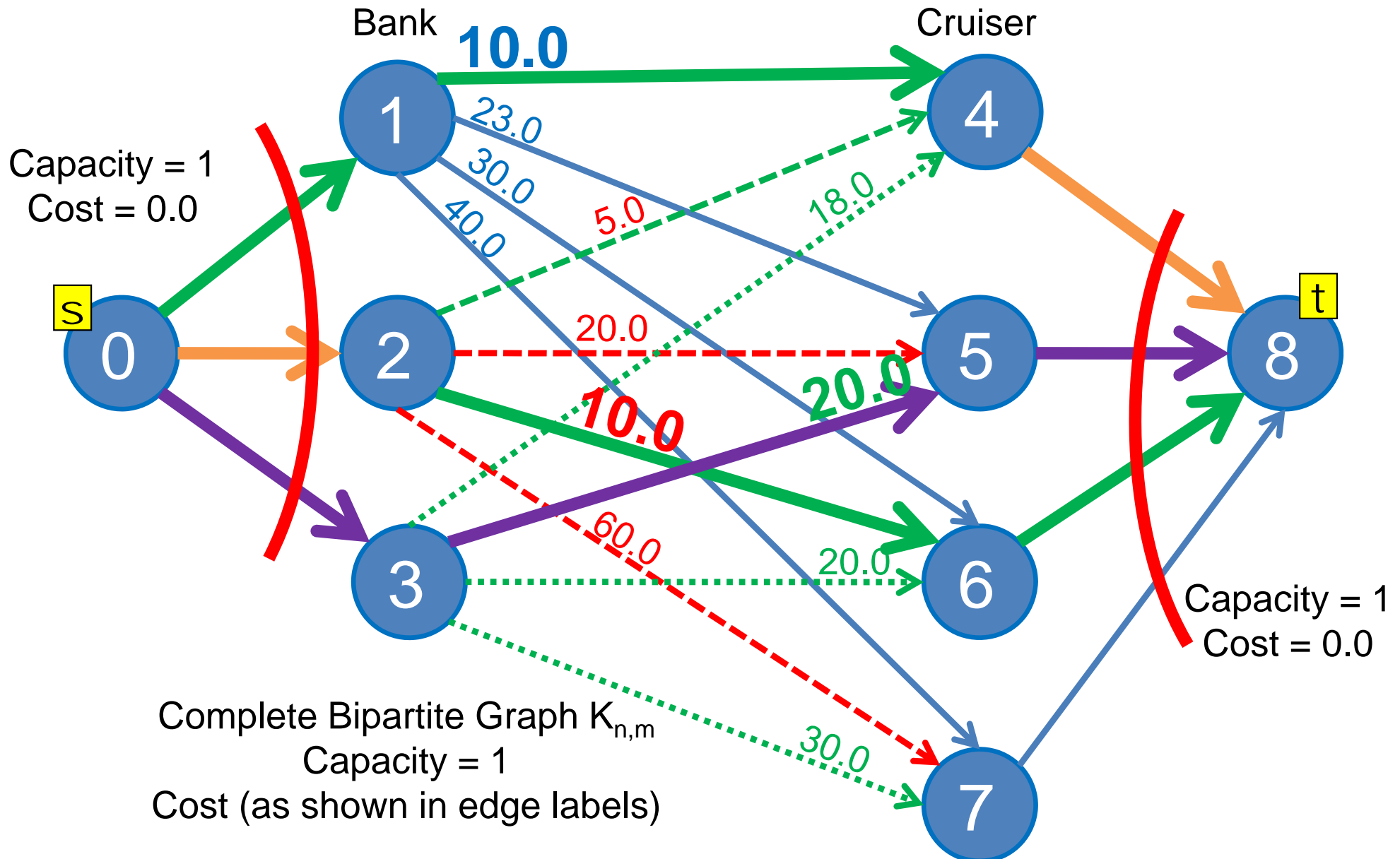
Min Cost Max Flow (Overview Only)

# **WEIGHTED MCBM**

# UVa 10746 (Solution)

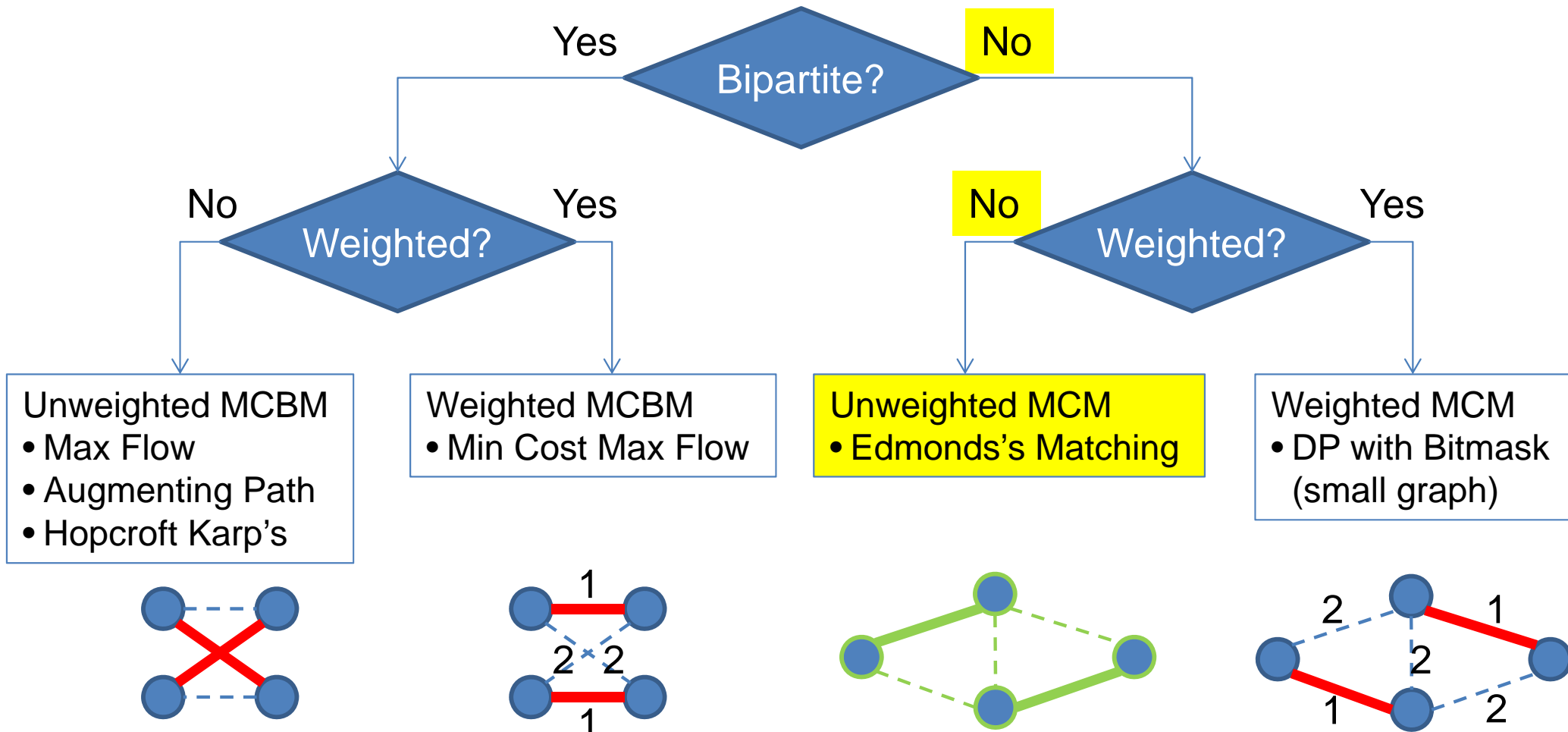
Min Cost so far =

$$0 + \mathbf{5.0} + 0 + 0 + 10.0 - \mathbf{5.0} + 10.0 + 0 + 0 + 20.0 + 0 = 40.0$$



Time Complexity: Depends on the chosen MCMF algorithm

# Types of Graph Matching



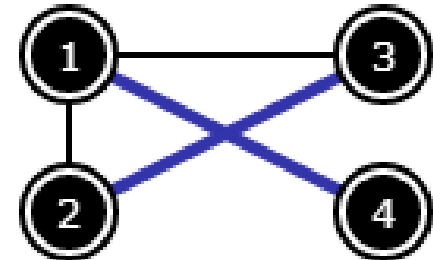
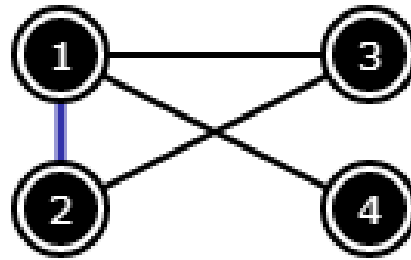
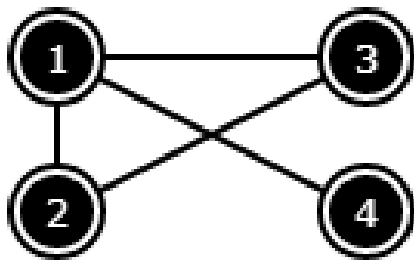
Solution:

Edmonds's Matching Algorithm

# **UNWEIGHTED MCM**

# Blossom

- A graph is not bipartite if it has at least one odd-length cycle (blossom)
- What is the MCM of this non-bipartite graph?

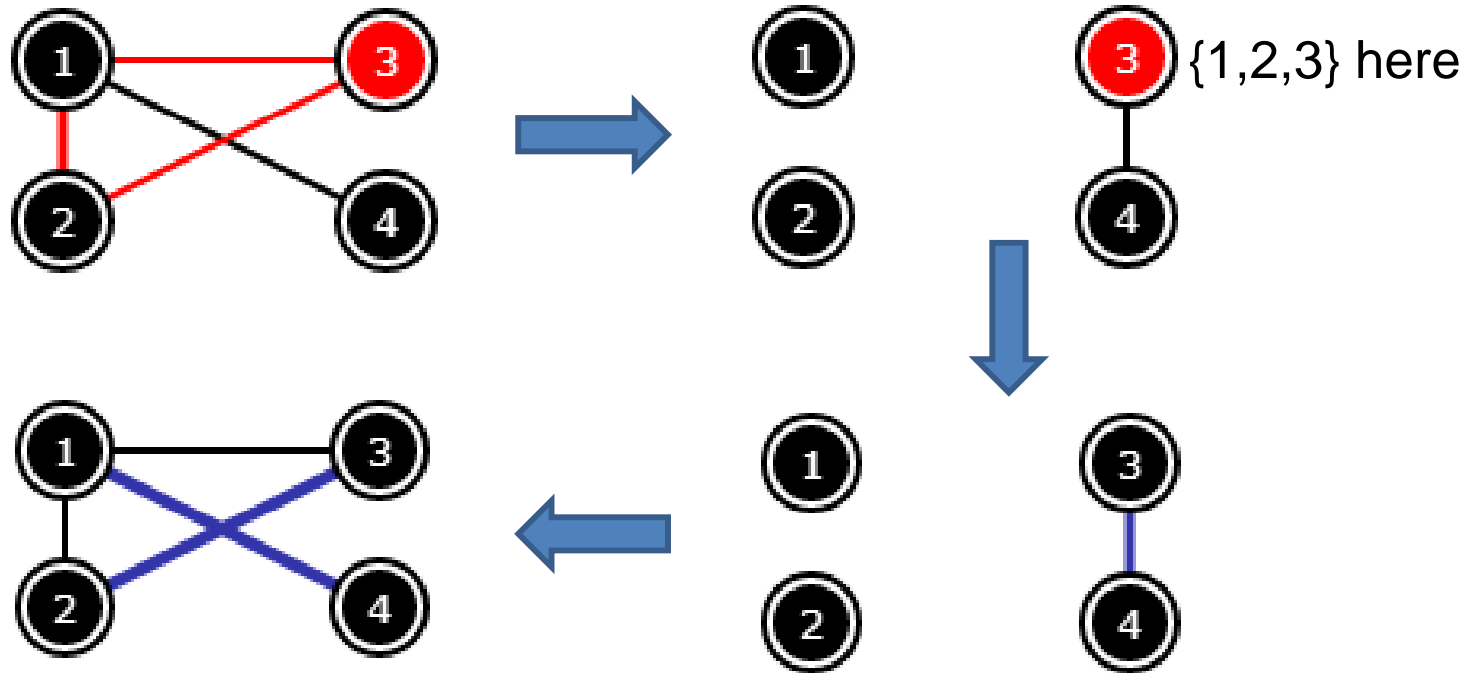


MCM = 2

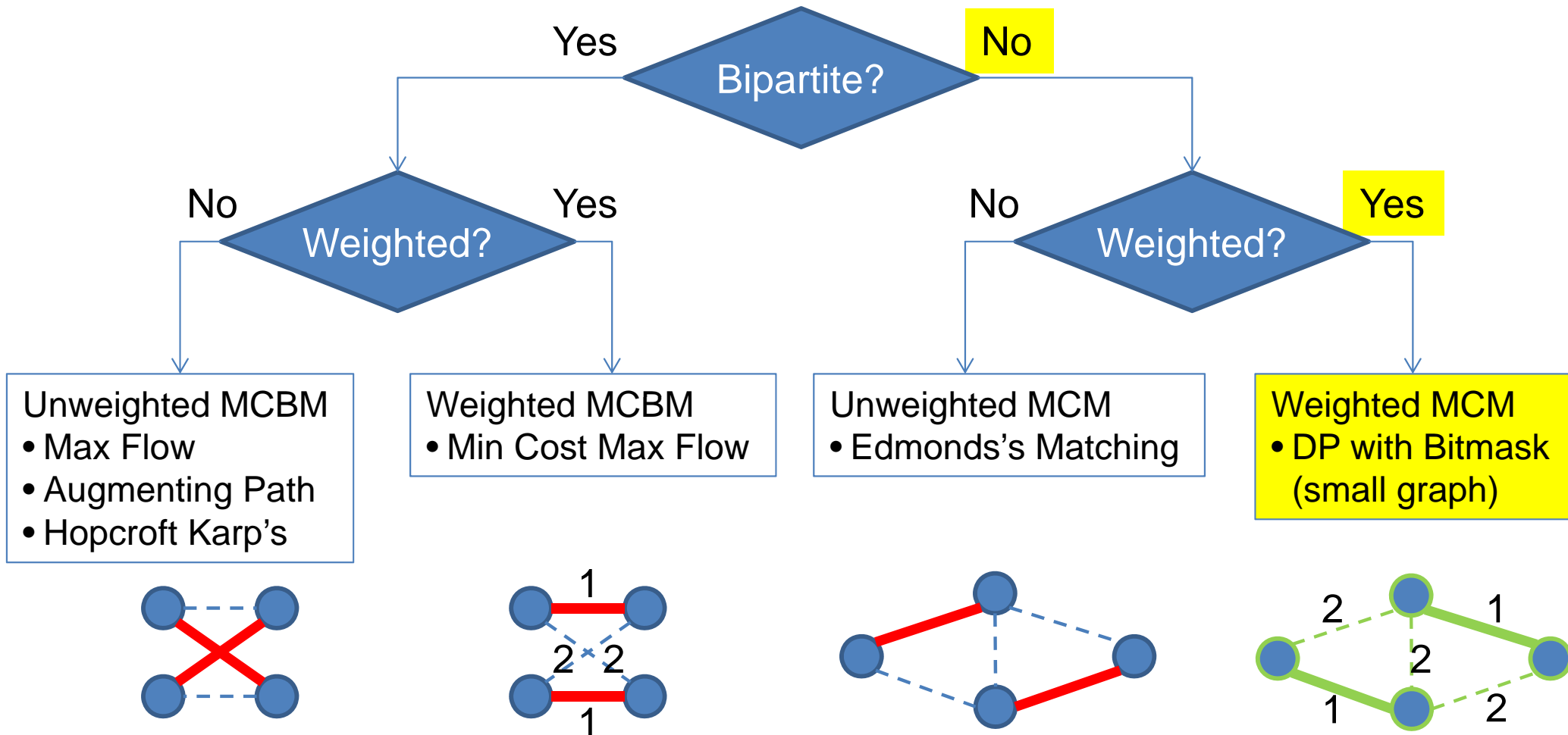
- Harder to find augmenting path in such graph

# Blossom Shrinking/Expansion

- Shrinking these blossoms (recursively) will make this problem “easy” again



# Types of Graph Matching





Solution:

DP with Bitmask (only for small graph)

# **WEIGHTED MCM**

# Graph Matching in ICPC

- Graph matching problem is quite popular in ICPC
  - Sometimes 0 problem but likely 1 problem in the set
  - Perhaps disguised as other problems, e.g. Vertex Cover, Independent Set, Path Cover, etc → reducible to matching
- If such problem appear and your team can solve it, very good 😊
  - Your team will have +1 point advantage over significant # of other teams who are not trained with this topic yet...
- For IOI trainees... all these Graph Matching stuffs...
  - **THEY ARE NOT IN THE SYLLABUS TOO :O:O:O...**

# References

- **CP2.9, Section 4.7.4, 9.15 ☺**
- **New write up about Graph Matching**