



# CPSC 490 – Problem Solving in Computer Science

## Lecture 23: Maximum Bipartite Matching

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# Last Time

- Introduced the Maximum Flow problem
- Discussed the Ford-Fulkerson algorithm
- Discussed the Max Flow - Min Cut Theorem

## Problem 1 - Edge-Disjoint Paths

- You are given a directed graph  $G$ .
- Find the number of edge disjoint paths from  $s$  to  $t$ .
- 2 paths  $P_1$  and  $P_2$  edge disjoint if they don't share any edges.

## Problem 1 - Solution

Just set the capacity of every edge to 1!

## Problem 2 - Vertex-Disjoint Paths

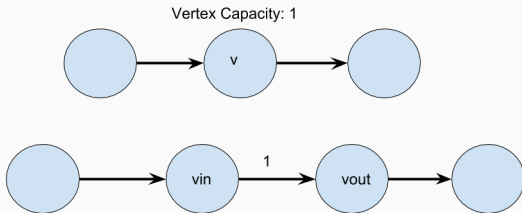
Find the number of vertex disjoint paths from  $s$  to  $t$ .

## Problem 2 - Solution

- We don't want paths to share a vertex  $\Rightarrow$  want vertex capacity 1
- But we only know how to deal with edge capacities...

## Problem 2 - Solution

- Split each vertex  $v$  into  $v_{in}$  and  $v_{out}$ .
- Add an edge  $v_{in} \rightarrow v_{out}$  with capacity 1.
- Change every edge  $u \rightarrow v$  to  $u_{out} \rightarrow v_{in}$

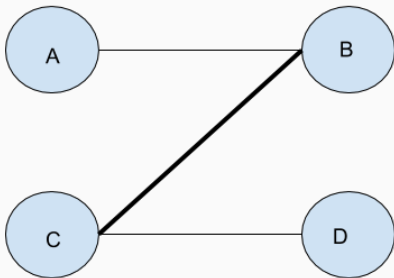


# Maximum Bipartite Matching

- A graph  $G = (V, E)$  is bipartite if  $V$  can be partitioned into disjoint sets  $A$  and  $B$  such that all edges goes from  $A$  to  $B$ .
- A matching is a subset of edges  $M \subset E$  such that no two edges touch same vertex
- Goal: find the maximum size matching in a bipartite graph.

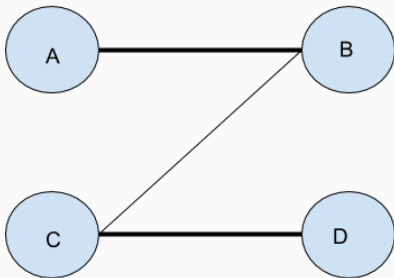


# Maximum Bipartite Matching



Size of the matching is 1.

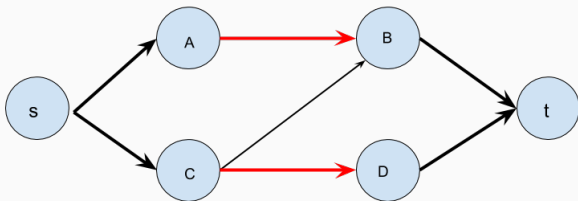
# Maximum Bipartite Matching



Size of the maximum matching is 2.

# Maximum Bipartite Matching

We can use maximum flow to solve this problem!



All edge capacities = 1.  
Edges with flow = 1 are in the matching

Assume  $m$  vertices on one side,  $n$  on other side,  $n \leq m$ , then time is

Ford Fulkerson:  $O(Ef) = O(mn^2)$

Dinic's:  $O(mn\sqrt{n})$  (also known as Hopcroft-Karp in this case)

## Problem 3 - Maximum Bipartite Matching

- There are  $m$  jobs and  $n$  applicants.
- Each applicant applies to a subset of the jobs.
- Each job can accept only 1 applicant
- Each applicant can only work at 1 job.
- What is the maximum number of applicants who get a job?

## Problem 3 - Solution

Idea: match applicants to jobs!

- Construct a bipartite graph with vertices for applicants and jobs.
- Add edge  $i \rightarrow j$  if applicant  $i$  applied for job  $j$
- Find the maximum matching!
- Time Complexity:  $O(nm(n + m))$ .

## Problem 4 - Match What to What?

$M \in \{0, 1\}^{n \times n}$  is rearrangeable if you can make all the diagonal entries 1 by swapping rows and columns. Determine if  $M$  is rearrangeable.

1	1	1
1	0	0
1	0	0

Not rearrangeable

1	1	1
1	1	0
1	0	0

Rearrangeable

## Problem 4 - Solution

Observation: want to pick  $n$  1's such that each row has exactly a single 1, each column has exactly a single 1

⇒ match rows to column ⇒ Bipartite Matching!

- Create a bipartite graph where left vertex = row, right vertex = col.
- Add edge  $i \rightarrow j$  if  $M[i][j] = 1$ .
- Determine if there is a matching of size  $n$ .

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- Create a bipartite graph where left vertex = row, right vertex = col.
- Add edge  $i \rightarrow j$  if  $M[i][j] = 1$ .
- Determine if there is a matching of size  $n$ .
- If row  $i$  matches column  $c_i$ , then we can swap column  $i$  and  $c_i$  and rearrange the matrix.
- Time Complexity:  $O(n^3)$



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- There are  $n$  airports and  $m$  flights.
- It takes  $t_{ij}$  time to fly from airport  $i$  to  $j$ .
- Each flight has a departure time.
- What is the minimum number of planes that we need to buy?  
We can add unscheduled flights to move planes around.

Hint: think of each flight as a vertex, what are the edges?

## Problem 5 - Solution

Idea: match a flight to its “next flight” so construct bipartite graph

- Each flight is a vertex on both left and right side
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Idea: match a flight to its “next flight” so construct bipartite graph

- Each flight is a vertex on both left and right side
- What are the edges?
  - $i \rightarrow j$  if flight  $i$  can finish it's trip, take the shortest path from  $i.destination$  to  $j.source$  in time for departure at  $j.source$
  - Use Floyd-Warshall to figure out shortest path!
  - This is where we may need to add an unscheduled flight.

Then we find maximum matching  $M$ : what does this tell us?

- Matching  $\Leftrightarrow$  set of valid disjoint flight sequences
- Unmatched on left side  $\Rightarrow$  last flight of a plane
- $\Rightarrow$  Answer is # unmatched vertices =  $m - |M|$

Time Complexity:  $O(n^3 + m^3)$

## Problem 6 - Is It A Matching?

- We are all supporters of a basketball team, Team 490.
- There are  $n$  teams in the league, and we know the number of wins and losses for each team.

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- We are all supporters of a basketball team, Team 490.
- There are  $n$  teams in the league, and we know the number of wins and losses for each team.
- We know the list of the  $G$  games remaining to be played.
- The team(s) with the highest number of wins at the end win.
- Is it possible for Team 490 to emerge as a winner?

## Problem 6 - Is It A Matching?

Team	Number of Wins
490	2
A	3
B	2
C	0

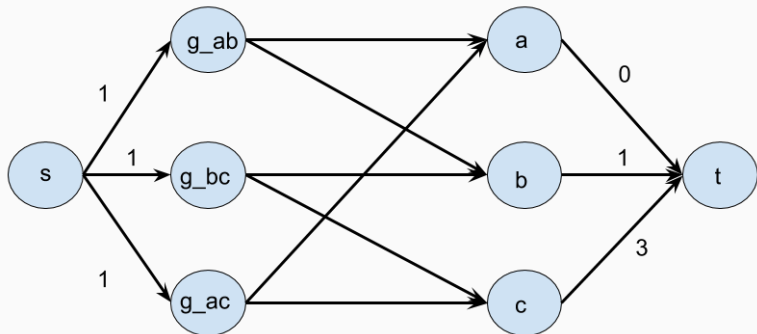
Games to be played
490 - A
A - B
B - C
C - A

Can team 490 be a winner in this scenario? Yes!

- Team 490 wins its remaining 1 game to end up with 3 wins.
- *B* wins its match with *A*, and *C* wins its two matches.

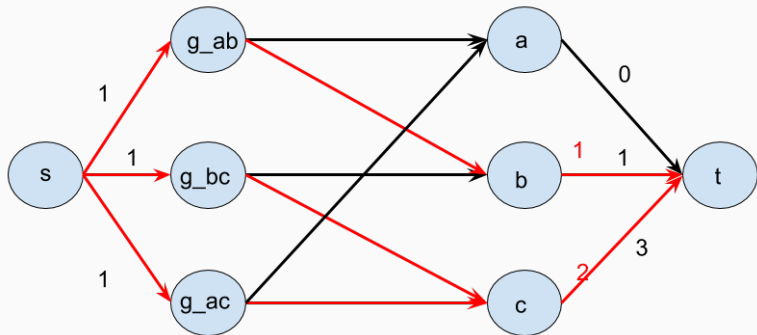


## Problem 6 - Solution



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The flows represent the winners of the games.

## Problem 6 - Solution

- Let Team 490 win all its remaining games to get total of  $w$  wins.
- If  $w < w_i$  for some team  $i$ , then it's not possible.
- Otherwise, use flow!

## Problem 6 - Solution

Idea: match games to winners, but upper bound how many games each team can win

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  - Left side: the remaining games  $g_{ij}$  not involving 490
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- Possible for Team 490 to win  $\Leftrightarrow$  flow = # games remain

# Konig's Theorem