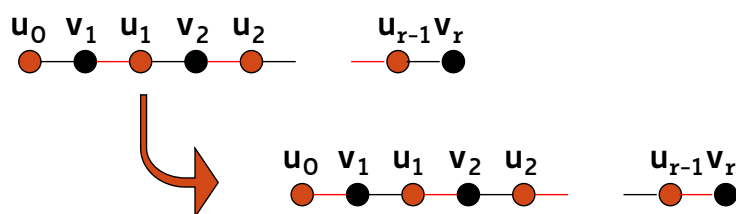


MAXIMUM MATCHING IN BIPARTITE GRAPHS (4)

(proof of the Hall theorem - contd) G bipartite with $|V_1| \leq |V_2|$, G has a perfect matching iff $\forall S \subseteq V_1, |S| \leq |\text{adj}(S)|$.

Continue in this way. As G is finite, we will eventually reach a node v_r that is free w.r.t. M . Each v_i is adjacent to at least one among u_0, u_1, \dots, u_{i-1} .

Analogously to the case $r=2$:



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MAXIMUM MATCHING IN BIPARTITE GRAPHS (5)

- The P. Hall Theorem does not provide an algorithmic method to construct a perfect matching (unless all subsets in V_1 are enumerated – exponential time issue).
- The perfect matching problem in a bipartite graph is equivalent to the maximum flow problem in a network:
Given $G=(V=V_1 \cup V_2, E)$, construct flow network $G'=(V', E')$ as follows:

...

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MAXIMUM MATCHING IN BIPARTITE GRAPHS (6)

$V': V \cup \{s\} \cup \{t\}$

E' : From the source s to all nodes in V_1 :

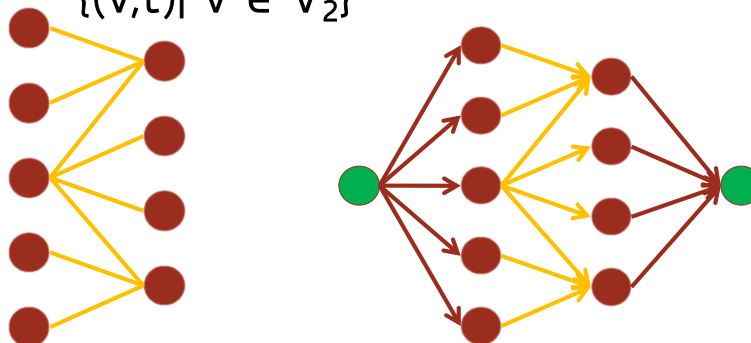
$$\{(s,u) \mid u \in V_1\} \cup$$

All edges in E :

$$\{(u,v) \mid u \in V_1, v \in V_2, e(u,v) \in E\} \cup$$

From all nodes in V_2 to the tale t :

$$\{(v,t) \mid v \in V_2\}$$



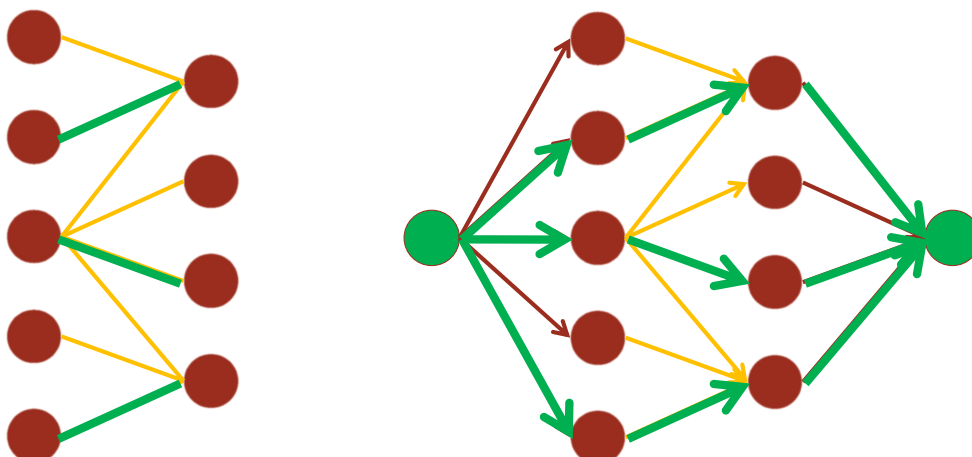
Capacity: $c(u,v) = 1$, for all $(u,v) \in E'$

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MAXIMUM MATCHING IN BIPARTITE GRAPHS (7)

Fact: Let M be a matching in a bipartite graph G . There exists a flow f in the network G' s.t. $|M|=|f|$.

Vice-versa, if f is a flow of G' , there exists a matching M in G s.t. $|M|=|f|$.



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MAXIMUM MATCHING IN BIPARTITE GRAPHS (8)

- **Th.:** (**integrality**) If the capacity c assumes only integer values, the max flow f is such that $|f|$ is integer. Moreover, for all nodes u and v , $f(u,v)$ is integer.
- **Corol.:** The cardinality of a max matching M in a bipartite graph G is equal to the value of the max flow f in the associated network G' .

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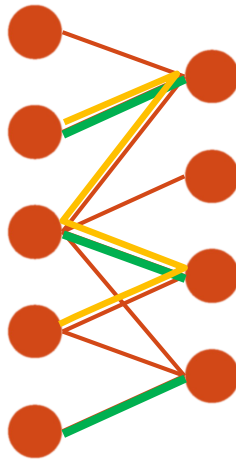
MAXIMUM MATCHING IN BIPARTITE GRAPHS (9)

- The algorithm by Ford-Fulkerson for the max flow in a network runs in $O(m|f|)$ time.
- In our special setting, the max flow of G' has cardinality upper bounded by $\min\{|V_1|, |V_2|\}$.
- Hence, the complexity of an algorithm for the max matching exploiting the max flow runs in $O(n m)$ time.

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MAXIMUM MATCHING IN BIPARTITE GRAPHS (10)

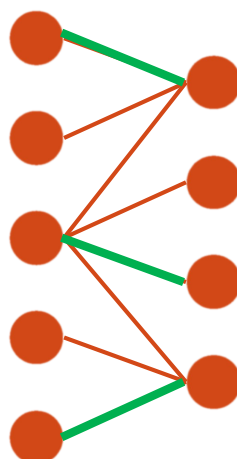
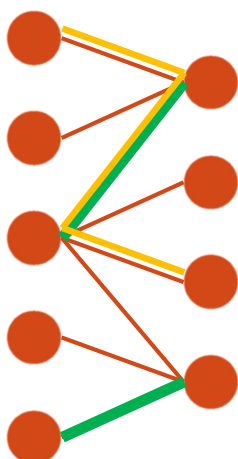
- **Def.** Given a matching M in a graph G , an **alternating path** w.r.t. M is the path alternating edges of M and edges in $E \setminus M$.



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MAXIMUM MATCHING IN BIPARTITE GRAPHS (11)

- **Def.** Given a matching M in a graph G , an **augmenting path** w.r.t. M is an alternating path starting and finishing in two free nodes w.r.t. M .



Swapping the role of the edges in M and in $E \setminus M$, M has larger cardinality.

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MAXIMUM MATCHING IN BIPARTITE GRAPHS (12)

- **Th. (Augmenting path)** [Berge 1975] M is a max matching iff there are no augmenting paths w.r.t. M .
- **Proof.**
- (\Rightarrow) If M max, then there are no augmenting paths.
Negating, if there are some augmenting paths, then M is not max. This is obvious because we can swap the role of the edges in the augmenting path and increase the cardinality of M .
- ...

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MAXIMUM MATCHING IN BIPARTITE GRAPHS (13)

(Proof of Th. M is a max matching iff there are no augmenting paths w.r.t. M – contd)

- (\Leftarrow) If there are no augmenting paths, then M is max.

By contradiction, M is not max. Let M' s.t. $|M'| > |M|$.

Consider graph H induced by M and M' . Edges that are both in M and in M' are put twice. So, H is a multigraph.

▪ ...

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MAXIMUM MATCHING IN BIPARTITE GRAPHS (14)

(Proof of Th. M is a max matching iff there are no augmenting paths w.r.t. M – contd)

- H has the following property:
 - For each v in H, $\deg(v) \leq 2$. (indeed, each node has at most one edge from M and one edge from M')
- So, each connected component of H is either a cycle or a path.
 - Cycles necessarily have even length; otherwise, a node would be incident to two edges of the same matching (M or M'); this is absurd by the definition of matching.

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MAXIMUM MATCHING IN BIPARTITE GRAPHS (15)

(Proof of Th. M is a max matching iff there are no augmenting paths w.r.t. M – contd)

- More in detail, the connected components of H can be classified into 6 kinds:

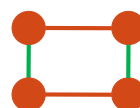
1. An isolated node



2. a 2-cycle



3. a $2k$ -cycle, $k > 1$



...

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MAXIMUM MATCHING IN BIPARTITE GRAPHS (16)

(Proof of Th. M is a max matching iff there are no augmenting paths w.r.t. M – contd)

...

4. a $2k$ -path



5. a $(2k+1)$ -path whose extremes are incident to M



6. a $(2k+1)$ -path whose extremes are incident to M'



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MAXIMUM MATCHING IN BIPARTITE GRAPHS (17)

(Proof of Th. M is a max matching iff there are no augmenting paths w.r.t. M – contd)

- Reminder: $|M| < |M'|$ by hp.
- Among all the components just defined, only 5 and 6 have a different number of edges from M and from M' ; only 6 has more edges from M' than from M.

- So, there is at least one component of kind 6



- This comp. is an augmenting path w.r.t. M: contradiction.

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MAXIMUM MATCHING IN BIPARTITE GRAPHS (18)

- We exploit the Augmenting Path Th. to design an iterative algorithm.
- During each iteration, we look for a new augmenting path using a modified Breadth First Search starting from the free nodes.
- In this way, nodes are structured in layers.

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MAXIMUM MATCHING IN BIPARTITE GRAPHS (19)

Idea of the algorithm:

- Let M be an arbitrary matching (possibly empty)
 - Find an augmenting path P
- While there is an augmenting path:
 - Swap in P the role of the edges in and out of the matching
 - Find an augmenting path P

Complexity: it depends on the complexity of finding an augmenting path.

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MAXIMUM MATCHING IN BIPARTITE GRAPHS (20)

Question: how to decide the existence of an augmenting path and how to find one, if one exists?

If $G=(V_1, V_2, E)$, direct edges in G according to M as follows:

- An edge goes from V_1 to V_2 if it does not belong to the matching M
- an edge goes from V_2 to V_1 if it does.

Call this directed graph D .

Claim. There exists an augmenting path in G w.r.t. M iff there exists a directed path in D between a free node in V_1 and a free node in V_2 .

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MAXIMUM MATCHING IN BIPARTITE GRAPHS (21)

▪ **Idea:**

- For each free node in V_1
- Run a DFS on D :
 - As soon as a free node in V_2 has been encountered, a new augmenting path has been found.

Complexity: $O(n+m)$

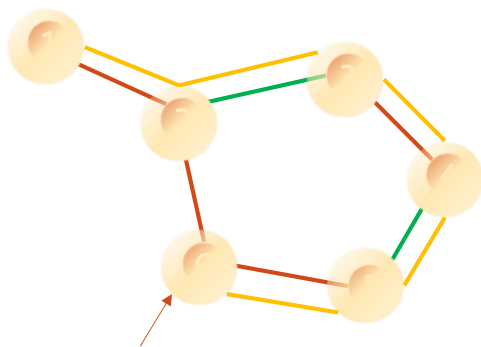
Complexity of the algorithm finding the max matching: $n/2[O(n+m)+O(n)]=O(nm)$

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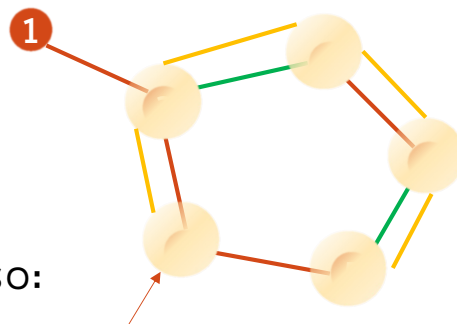
MAXIMUM MATCHING IN BIPARTITE GRAPHS (22)

(a parenthesis)
What if G is
not bipartite?

- For each free node
- Run a modified DFS:
 - Keep trace of the current layer
 - If the layer is even, use an edge in M
 - If the layer is odd, use an edge in $E \setminus M$
 - As soon as a free node has been encountered, a new augmenting path has been found



But also:

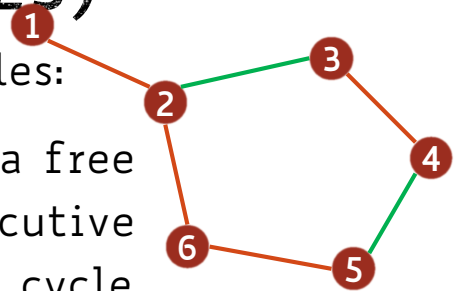


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MAXIMUM MATCHING IN BIPARTITE GRAPHS (23)

Problem: the presence of odd cycles:

- In an odd cycle, there is always a free node adjacent to two consecutive edges not in M belonging to the cycle
- If the search goes through the cycle along the “wrong” direction, the augmenting path is not detected.



It is necessary to have graphs without odd cycles
= bipartite graphs.

We will handle the general case later...

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MAXIMUM MATCHING IN BIPARTITE GRAPHS (24)

- The **Hopcroft-Karp algorithm** (1973) finds a max matching in a bipartite graph in $O(m\sqrt{n})$ time (better than the previous $O(mn)$).
- The idea is similar to the previous one, and consists in augmenting the cardinality of the current matching exploiting augmenting paths.
- During each iteration, this algorithm searches not one but a maximal set of augmenting paths.
- In this way, only $O(\sqrt{n})$ iterations are enough.

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MAXIMUM MATCHING IN BIPARTITE GRAPHS (25)

Hopcroft-Karp Algorithm

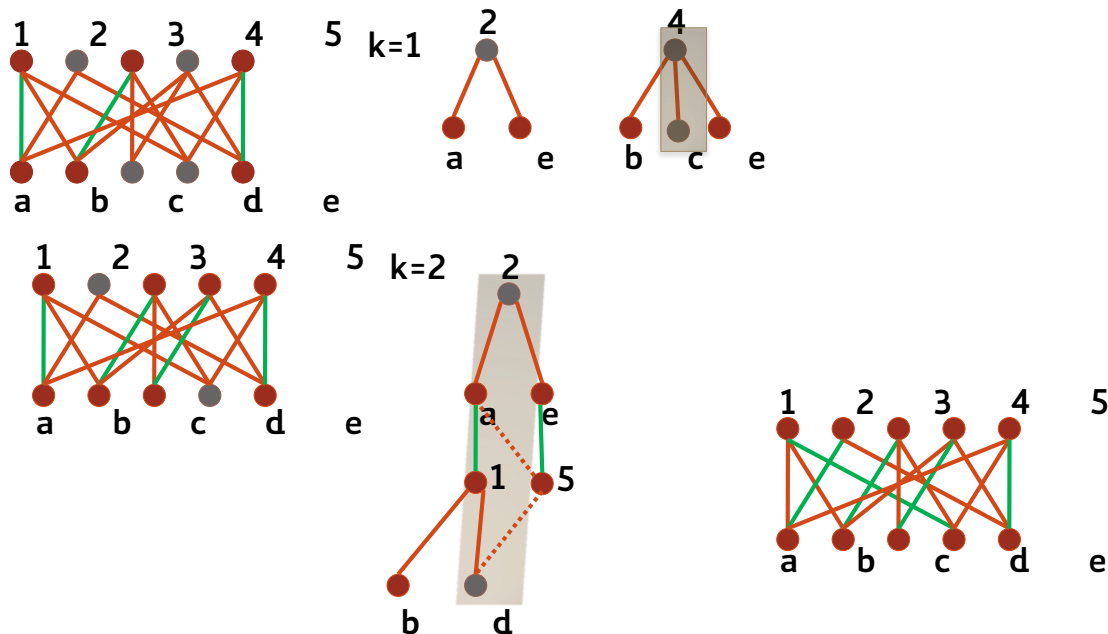
During the k -th step:

- Run a modified **breadth first search** starting from ALL the free nodes in V_1 . The BFS ends when some free nodes in V_2 are reached at layer $2k-1$.
- All the detected free nodes in V_2 at layer $2k-1$ are put in a set F . **Obs.** v is put in F iff it is the endpoint of an aug. path
- Find a maximal set of length $2k-1$ aug. paths node disjoint using a **depth first search** from the nodes in F back to the starting nodes in V_1 (climbing on the BFS tree).
- Each aug. path is used to augment the cardinality of M .
- The algorithm ends when there are no more aug. paths.

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MAXIMUM MATCHING IN BIPARTITE GRAPHS (26)

Example: Hopcroft-Karp algorithm



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MAXIMUM MATCHING IN BIPARTITE GRAPHS (27)

Analysis of the Hopcroft-Karp algorithm (sketch)

Each step consists in a BFS and a DFS. Hence it runs in $\Theta(n+m) = \Theta(m)$ time.

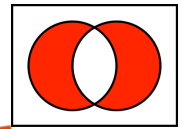
How many steps?

- The first \sqrt{n} steps take $\Theta(m\sqrt{n})$ time.
- Note. At each step, the length of the found aug. paths is larger and larger; indeed, during step k , ALL paths of length $2k-1$ are found and, after that, only longer aug. paths can be in the graph.
- So, after the first \sqrt{n} steps, the shortest aug. path is at least $2\sqrt{n}+1$ long.
- ...

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MAXIMUM MATCHING IN BIPARTITE GRAPHS (28)

Analysis of the Hopcroft-Karp algorithm (sketch) – contd



- The **symmetric difference** between a maximum matching and the partial matching M found after the first \sqrt{n} steps is a set of vertex-disjoint alternating cycles, alternating paths and augmenting paths.
- Consider the augmenting paths. Each of them must be at least \sqrt{n} long, so there are at most \sqrt{n} such paths. Moreover, the maximum matching is larger than M by at most \sqrt{n} edges.
- ...

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MAXIMUM MATCHING IN BIPARTITE GRAPHS (29)

Analysis of the Hopcroft-Karp algorithm (sketch) – contd

- ...
- Each step of the algorithm augments the dimension of M by one, so at most \sqrt{n} further steps are enough.
- The whole algorithm executes at most $2\sqrt{n}$ steps, each running in $\Theta(m)$ time, hence the time complexity is $\Theta(m\sqrt{n})$ in the worst case.

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