

Introduction to

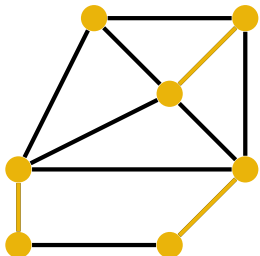
Linear and Combinatorial Optimization

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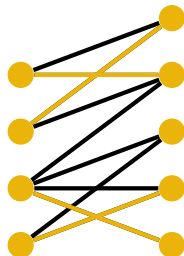
Bipartite Matchings

11.1 Definition and Computation

Definition 11.1 A **matching** in an undirected graph $G = (V, E)$ is a subset of edges $M \subseteq E$ with $e \cap e' = \emptyset$ for all $e, e' \in M$ with $e \neq e'$.



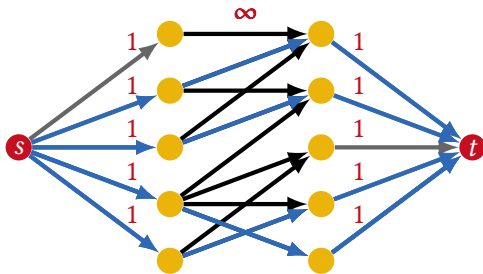
Matching M



Matching M in a bipartite graph

- recall that a graph $G = (V, E)$ is **bipartite** if V can be partitioned into L and R such that $E \subseteq \{\{l, r\} : l \in L, r \in R\}$

- a matching M is called a **maximum matching** if it has maximum cardinality, i.e., $|M| \geq |M'|$ for all matchings M'
- a matching is called **perfect** if $|M| = |V|/2$
- computation of maximum matchings in general graphs \rightarrow ADM II
- the computation of maximum matchings in bipartite graphs can be done via a reduction to the maximum flow problem in $O(nm)$



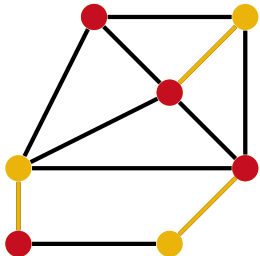
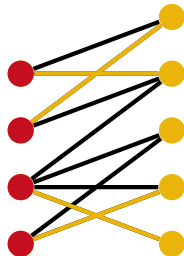
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Bipartite Matchings

11.2 König's Theorem

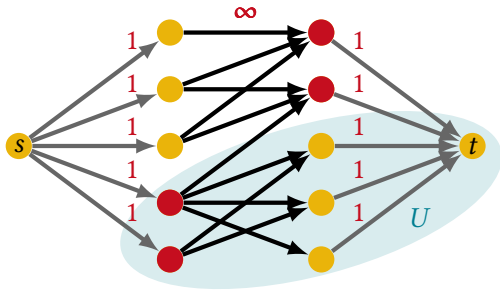
Definition 11.2 A **node cover** for an undirected graph $G = (V, E)$ is a subset of nodes $C \subseteq V$ with $e \cap C \neq \emptyset$ for all $e \in E$.

Node cover C Node cover C in a bipartite graph

Observation: $|M| \leq |C|$ for any matching M and node cover C .

Theorem 11.3 In bipartite graphs, the maximum cardinality of a matching equals the minimum cardinality of a node cover.

Proof: (Idea) Use max-flow min-cut theorem. Consider min-cut $\delta^-(U)$:



Observation: König's Theorem does not hold for arbitrary graph:

That is, there can be a 'duality gap' up to a factor of 2:

$|M| \leq |C| \leq 2|M|$ for max matching M and min node cover C . (Why?)



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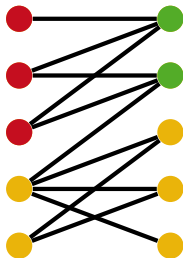
Bipartite Matchings

11.3 Hall's Theorem

When does a bipartite graph have a perfect matching?

- $|L| = |R|$ is clearly necessary
- there is no perfect matching if there is a set $S \subseteq L$ with too few potential matches $N(S)$, i.e., $|S| > |N(S)|$ where

$$N(S) = \{r \in R : \exists \{l, r\} \in E \text{ with } l \in S\}$$



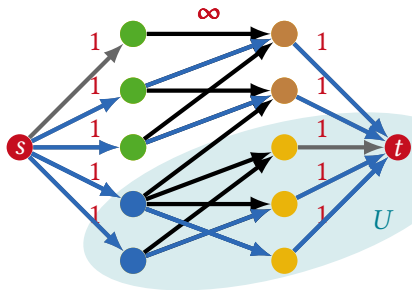
Theorem 11.4 (Marriage Theorem) A bipartite graph with $|L| = |R|$ has a perfect matching if and only if $|N(S)| \geq |S|$ for all $S \subseteq L$.

Proof:

- if $|N(S)| < |S|$ for some $S \subseteq L$, there is no perfect matching
- suppose no perfect matching
- consider min-cut $\delta^-(U)$, $u(\delta^-(U)) < |L|$
- $L^- = L \setminus U$, $L^+ = L \cap U$, $R^- = R \setminus U$
- $u(\delta^-(U)) = |L^+| + |R^-|$
- $N(L^-) \subseteq R^-$ since $\delta^-(U)$ cannot contain ∞ -arcs, thus,

$$|N(L^-)| \leq |R^-| = u(\delta^-(U)) - |L^+| < |L| - |L^+| = |L^-|$$

- choose $S = L^-$



□

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Bipartite Matchings

11.4 Stable Matchings

Stable Marriage/Matching Problem

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Given: set M of men and set W of women with $|M| = |W| = n$
every $m \in M$ has a total preference order over W
every $w \in W$ has a total preference order over M

Task: find a *stable* matching

Stability: no incentive for a pair to undermine assignment by joint action.

- unmatched pair m, w is a **blocking pair** if man m and woman w prefer each other to their current partners
- Stable matching:** perfect matching with no blocking pair.

M	1st	2nd	3rd
Xaver	Anne	Birte	Clara
Yann	Birte	Anne	Clara
Zoltan	Anne	Birte	Clara

W	1st	2nd	3rd
Anne	Yann	Xaver	Zoltan
Birte	Xaver	Yann	Zoltan
Clara	Xaver	Yann	Zoltan

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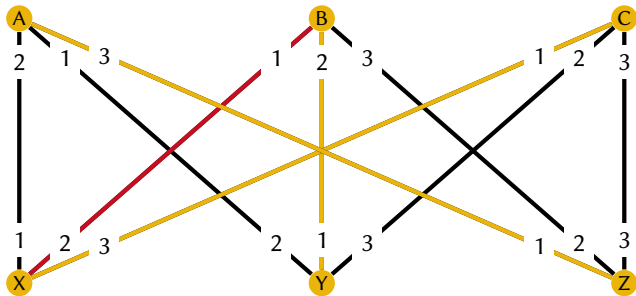
W	1st	2nd	3rd
Anne	Yann	Xaver	Zoltan
Birte	Xaver	Yann	Zoltan
Clara	Xaver	Yann	Zoltan

Example

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<i>M</i>	1st	2nd	3rd
Xaver	Anne	Birte	Clara
Yann	Birte	Anne	Clara
Zoltan	Anne	Birte	Clara

<i>W</i>	1st	2nd	3rd
Anne	Yann	Xaver	Zoltan
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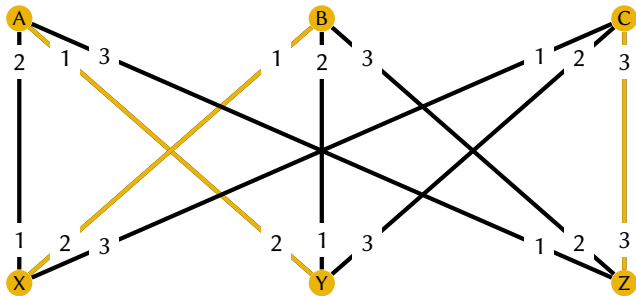


Example

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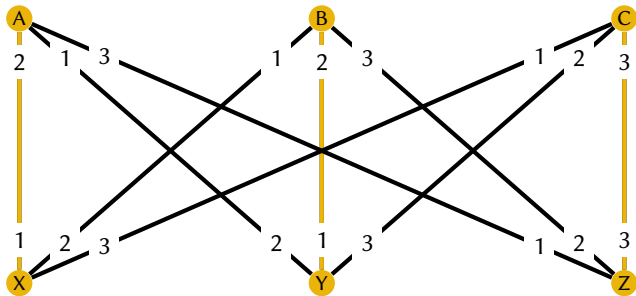


Example

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Clara	Xaver	Yann	Zoltan



- for $m \in M$ and $w, w' \in W$ we write $w <_m w'$ if m prefers w to w'
- For $w \in W$ and $m, m' \in M$ we write $m <_w m'$ if w prefers m to m'

Gale-Shapley Algorithm

- 1 initially, all men and women are free (i.e., not engaged)
- 2 while there exists a free man $m \in M$
- 3 let w be first woman (w.r.t. $<_m$) to whom m has not yet proposed
- 4 if w is free or engaged to $m' \in M$ with $m <_w m'$
- 5 m and w become engaged (and m' becomes free)

Theorem 11.5 The Gale-Shapley Algorithm finds a stable matching in time $O(n^2)$.

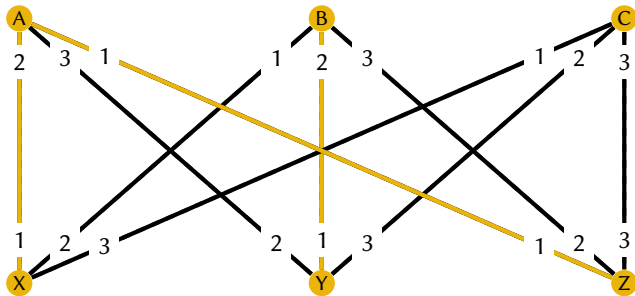
D. Gale, L. S. Shapley: College Admissions and the Stability of Marriage, *American Mathematical Monthly* 69, 9-14, 1962

Gale-Shapley Algorithm: Example

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M	1st	2nd	3rd
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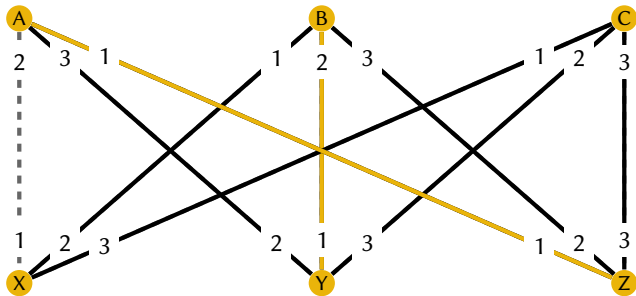


Gale-Shapley Algorithm: Example

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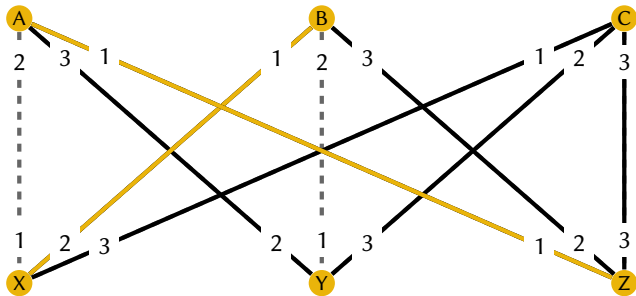


Gale-Shapley Algorithm: Example

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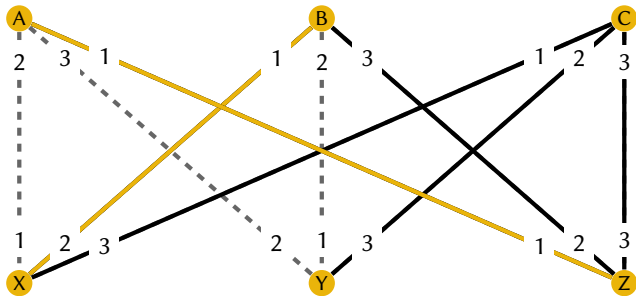


Gale-Shapley Algorithm: Example

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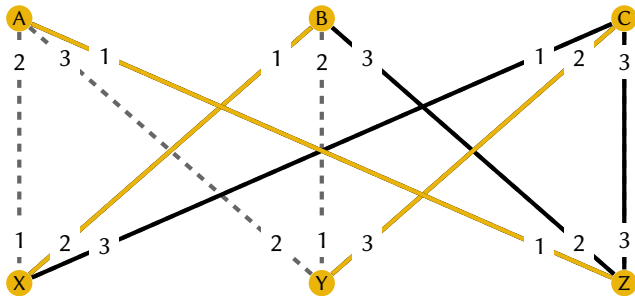


Gale-Shapley Algorithm: Example

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The algorithm computes a perfect matching in time $O(n^2)$ because:

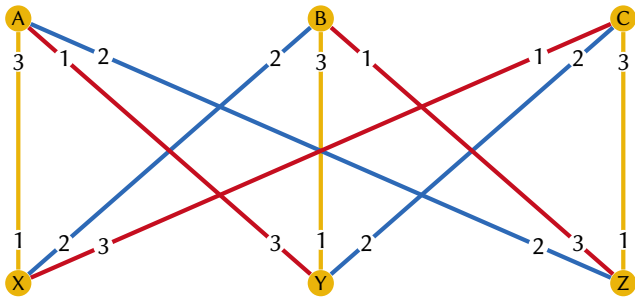
- i** The edges joining currently engaged couples always form a matching.
- ii** By construction, once a woman w is engaged, she always remains engaged while her fiancé may change (and only get better w.r.t. $<_w$).
- iii** The woman w in Step 3 always exists: Since $|M| = |W|$ and m is free, there exists a free woman w' to whom m has not yet proposed by **ii**.
- iv** In every iteration, a man proposes. Since every man proposes to every woman at most once, the number of iterations is bounded by $O(n^2)$.

We now argue that the computed matching is stable:

- Assume by contradiction that there is an instability m, w , i.e., m is matched with $w' >_m w$ and w is matched with $m' >_w m$.
- Before proposing to his wife w' , m must have proposed to w .
- From then on, by **ii**, w is always engaged to some man whom she likes at least as good as m . ⚡



Example:



- All three matchings (yellow, blue, red) are stable.
- The yellow matching found by the Gale-Shapley Algorithm is best possible for all men and worst possible for all women.
- The red matching is best possible for all women and worst possible for all men (found by Gale-Shapley if women propose instead of men).
- The blue matching lies in between and might be a good compromise.

For $x \in M \cup W$, let $\text{best}(x)$ and $\text{worst}(x)$ be the best and worst partner (w.r.t. $<_x$), respectively, that x can have in any stable matching.

Theorem 11.6 The Gale-Shapley Algorithm matches every man m to $\text{best}(m)$ and every woman w to $\text{worst}(w)$. In particular, it finds a unique stable matching.

Remarks

- stable matchings can be generalized to arbitrary bipartite graphs (not necessarily complete, $|M| \neq |W|$ etc.)
- in non-bipartite graphs, the problem is known as the Stable Roommates Problem.
- in 2012, the Nobel Memorial Prize in Economics was awarded to Lloyd S. Shapley and Alvin E. Roth “for the theory of stable allocations and the practice of market design.”

Claim: For each $m \in M$, $\text{worst}(\text{best}(m)) = m$.

Proof: Otherwise, for $w := \text{best}(m)$ we get $m <_w \text{worst}(w)$.

Consider stable matching where w is matched with $\text{worst}(w)$.

Then, m is matched with some $w' \neq w = \text{best}(m)$ such that $w <_m w'$.

As $m <_w \text{worst}(w)$ and $w <_m w'$, pair m, w is a blocking pair. ⚡



Proof of Theorem 11.6:

By contradiction, consider first iteration in which some $m \in M$ is rejected by $w := \text{best}(m)$ in favor of $m' <_w m$.

Then, m' has not previously been rejected by $\text{best}(m')$ and thus likes w better than any $w' \neq w$ he can be matched with in a stable matching.

Consider a stable matching where m is matched with $w = \text{best}(m)$.

Then m' is matched with $w' >_{m'} w$ and m', w is a blocking pair. ⚡

