Bipartite Matchings and Stable Marriage

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Lets start with some fun..



- A chess board with 2 corners removed.
- An infinite supply of 2×1 tiles.



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Can you tile the chess board?

Some routine admin tasks..



- How does your dept. do project allotments?
- How does it do course allotments to faculty?
- What do we want to achieve while doing these allotments?



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	JEE Main	JEE Advanced
Rohan	32	447
Avanti	10	663



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Common Counselling for IITs, NITs, IIITs, GFTIs - India 2015

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- Scale of the problem: 34,000 odd seats across the country competed by 1.5 lakh students.
- No longer possible to do manual allotments!

What ties them together?





What ties them together?



A beautiful theory of matchings and stable marriage

- Quick introduction to graphs.
- Matchings in graphs.
- Bipartite matching algorithm.
- Stable matchings.

Introduction to graphs

Represent binary relations between objects



$$G = (V, E)$$
; $n = |V| = 6$, $m = |E| = 8$.
How large can *m* be?

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Representation:

- Adj. lists O(m + n) space.
- Adj. matrix O(n²) space.

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How large can *m* be?

Representation:

- Adj. lists O(m + n) space.
- Adj. matrix $O(n^2)$ space.

Search methods:

- ► Breadth First Search.
- ► Depth First Search.

Matching in a graph

Matching in a graph

A matching M is a set of vertex disjoint edges.



Matching in a graph

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- **Goal:** compute a largest sized matching.
 - Question: is the above matching as large as possible?

Maximal vs. maximum matchings



- No more edges can be added.
- Size need not be the largest possible.

Maximal vs. maximum matchings





- No more edges can be added.
- Size need not be the largest possible.
- Largest possible size.
- ► Maximum ≥ maximal.

A path having alternate matched and unmatched edges.



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Is there any other alternating path?

A path having alternate matched and unmatched edges.



- Is there any other alternating path?
- Which paths are not alternating?

An alternating path starting and ending in free vertices.



An alternating path starting and ending in free vertices.



- How are augmenting paths useful?
- Properties of augmenting paths.

• If aug. path p is present \Rightarrow size of matching can be increased.

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- Suppose *M* does not admit any aug. path and still it is not maximum.
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Proof (by contradiction)

- Suppose *M* does not admit any aug. path and still it is not maximum.
- Some other matching *M*' is maximum.
- Consider $H = (V, M \oplus M')$.
 - Every vertex has degree at most 2.
 - *H* is a collection of paths and even cycles.
- Construct an aug. path w.r.t. *M*.

Maximum matching algorithm

Iterative improvement algorithm

Input: Graph G = (V, E). Output: A maximum sized matching M in G.

- 1. initialize M to be empty.
- 2. while there exists an aug. path p w.r.t. M

•
$$M = M \oplus p$$
.

3. return *M*.

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Two questions that need to be always asked:

1. correctness

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- 1. correctness \checkmark .
- 2. complexity/ running time?

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How to efficiently compute an augmenting path?

Bipartite matching algorithm



When is G bipartite?



When is *G* bipartite?

- Vertices can be partitioned into 2 disjoint sets.
- G does not have any odd cycle.
- ► G is 2-colorable.



- Is this matching maximal?
- Are there augmenting paths with respect to M?



Aug. paths w.r.t. M: $\langle a_1, b_2 \rangle.$ $\langle a_5, b_5 \rangle.$ $\langle a_4, b_3, a_2, b_4 \rangle.$



Finding aug. paths – reachability in a modified graph.

This makes the bipartite case easy!





- ► Add dummy nodes *s* and *t*.
- Add edges from s to unmatched vertices in A.
- Add edges from unmatched vertices in *B* to *t*.
- Matched edges: $B \rightarrow A$.
- Unmatched edges: $A \rightarrow B$.



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A directed path p from s to $t \leftrightarrow$ there exists an aug. path w.r.t. M.

Matching algorithm is Reduction

Iterative improvement algorithm

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Running time?

1. How many iterations?

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- 1. How many iterations? O(n)
- 2. How long does each iteration take? O(m + n).
- 3. Total running time: O(mn).

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- Algorithms on general graphs are significantly involved.
 Edmond's Blossom Shrinking algorithm. (Also the paper where the notion of polynomial time being efficient was formalized).
- ▶ Weighted matchings can also be computed in polynomial time.



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- Can you tile the chess board with dominoes?



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32 red cells 30 yeL cells It is impossible to match all vertices, therefore no tiling exists!

Stable matching problem

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- Context of college admissions.
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 - ► National Residency Matching Program (NRMP), USA.
 - Scottish Foundation Allocation (SFA), UK.
 - Joint Seat Allocation (JoSA), India 2015.
 - • •

▶ Classical setting: marriage between *n* men and *n* women.

Input:

<i>m</i> ₁ :	w_1, w_2, w_3	w_1 :	m_3, m_2, m_1
<i>m</i> ₂ :	w_2, w_3, w_1	<i>w</i> ₂ :	m_2, m_1, m_3
<i>m</i> 3 :	w_3, w_1, w_2	<i>W</i> 3:	m_1, m_3, m_2

Goal: To compute a matching that is "optimal".

Input:

<i>m</i> ₁ :	w_1, w_2, w_3	w_1 :	m_3, m_2, m_1
<i>m</i> ₂ :	w_2, w_3, w_1	<i>w</i> ₂ :	m_2, m_1, m_3
<i>m</i> ₃ :	w_3, w_1, w_2	W3 :	m_1, m_3, m_2

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Question: Is this a good matching?

Input:

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<i>m</i> ₃ :	w_3, w_1, w_2	W3 :	m_1, m_3, m_2

Goal: To compute a matching that is "optimal".



Question: Is this a good matching? pair (m_2, w_2) is bad!

Input:

m_1 :	w_1, w_2, w_3	<i>w</i> ₁ :	m_3, m_2, m_1
<i>m</i> ₂ :	w_2, w_3, w_1	<i>w</i> ₂ :	m_2, m_1, m_3
<i>m</i> 3 :	w_3, w_1, w_2	W3 :	m_1, m_3, m_2

Goal: To compute a matching that is "stable".

Input:

m_1 :	w_1, w_2, w_3	<i>w</i> ₁ :	m_3, m_2, m_1
<i>m</i> ₂ :	w_2, w_3, w_1	W ₂ :	m_2, m_1, m_3
<i>m</i> ₃ :	w_3, w_1, w_2	W3 :	m_1, m_3, m_2

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Goal: To compute a matching that is "stable".



unstable pair: A pair (m, w) not matched to each other, both of which prefer each other to their current partners in M.
Input:

<i>m</i> ₁ :	w_1, w_2, w_3	<i>w</i> ₁ :	m_3, m_2, m_1
<i>m</i> ₂ :	w_2, w_3, w_1	<i>w</i> ₂ :	m_2, m_1, m_3
<i>m</i> ₃ :	w_3, w_1, w_2	W3 :	m_1, m_3, m_2

Goal: To compute a matching that is "stable".

Does a stable marriage exist in any instance?

Input:

<i>m</i> ₁ :	w_1, w_2, w_3	<i>w</i> ₁ :	m_3, m_2, m_1
<i>m</i> ₂ :	w_2, w_3, w_1	<i>w</i> ₂ :	m_2, m_1, m_3
<i>m</i> ₃ :	w_3, w_1, w_2	W3 :	m_1, m_3, m_2

- Does a stable marriage exist in any instance?
- Is stable marriage unique?

Input:

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- Does a stable marriage exist in any instance?
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- Can it be computed efficiently?

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- Does a stable marriage exist in any instance? Yes, always!
- Is stable marriage unique?

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- Is stable marriage unique? No, there is a range of stable matchings; can be unique in some cases.
- Can it be computed efficiently?

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- Does a stable marriage exist in any instance? Yes, always!
- Is stable marriage unique? No, there is a range of stable matchings; can be unique in some cases.
- Can it be computed efficiently? Yes, in $O(n^2)$ time.

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Gale and Shapley algorithm

- set all men and women as unengaged.
- while there exists an unengaged man m
 - 1. *m* proposes to the most preferred woman *w* to whom he has not yet proposed.
 - 2. *w* accepts if either she is unengaged or she is engaged to *m*' and *w* prefers *m* to *m*'.

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Questions:

Does the algorithm even terminate?

<i>m</i> ₁ :	w_1, w_2, w_3	<i>w</i> ₁ :	m_3, m_2, m_1
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Questions:

- Does the algorithm even terminate?
- Why does it output a stable marriage?

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<i>m</i> ₂ :	w_2, w_3, w_1	W ₂ :	m_2, m_1, m_3
<i>m</i> ₃ :	w_3, w_1, w_2	W3 :	m_1, m_3, m_2

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Questions:

- Does the algorithm even terminate?
- Why does it output a stable marriage?
- How does the ordering of men in the while loop matter?

- A surprisingly simple algorithm that is guaranteed to produce a stable matching.
- A rich structure underlying the problem.

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- A rich structure underlying the problem.
 Has been dealt in two books one by Irving and Gusfield and a recent one by Manlove.
- National Residency Matching program one of the most important applications amongst several others.
- Pioneering work by Roth and Shapley won the 2012 Nobel prize for Economics.

- Matchings, definitions, augmenting/alternating paths.
- A template for finding matchings by iterative improvement.
- An efficient algorithm in the bipartite case.
- Stable marriage algorithm and properties.

Thank You!