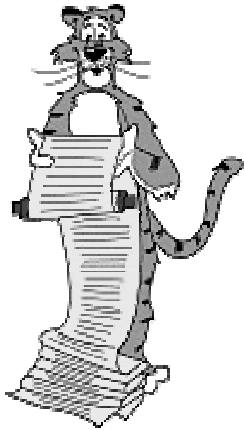


Love, Marriage, and Lying

Lecture P4



1/26/00

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P4.1

Overview

Use arrays to solve interesting problem.

Understand mathematics of marriage proposals.

- Who benefits more, the men or women?
- Who should misrepresent their feelings?

Enjoy yourself today!

Standard disclaimer.

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P4.2

Stable Marriage Problem

Problem: Given N men and N women, find a “suitable” matching between men and women.

- Participant have ordered preference list of members of opposite sex.
- Each man lists women in order of preference from best to worst.



Men's Preference List

Man	0 th	1 st	2 nd	3 rd	4 th
Victor	Bertha	Amy	Diane	Erika	Clare
Wayne	Diane	Bertha	Amy	Clare	Erika
Xavier	Bertha	Erika	Clare	Diane	Amy
Yancey	Amy	Diane	Clare	Bertha	Erika
Zeus	Bertha	Diane	Amy	Erika	Clare

↑
best

↑
worst

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P4.3

Stable Marriage Problem

Problem: Given N men and N women, find a “suitable” matching between men and women.

- Participant have ordered preference list of members of opposite sex.
- Each man lists women in order of preference from best to worst.
- Each woman lists men in order of preference.



Women's Preference List

Woman	0 th	1 st	2 nd	3 rd	4 th
Amy	Zeus	Victor	Wayne	Yancey	Xavier
Bertha	Xavier	Wayne	Yancey	Victor	Zeus
Clare	Wayne	Xavier	Yancey	Zeus	Victor
Diane	Victor	Zeus	Yancey	Xavier	Wayne
Erika	Yancey	Wayne	Zeus	Xavier	Victor

↑
best

↑
worst

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P4.4

Stable Marriage Problem

Problem: Given N men and N women, find a “suitable” matching between men and women.

- Everyone is matched monogamously (perfect matching).
 - each man gets exactly one woman
 - each woman gets exactly one man
- Stable: no incentive for some pair of participants (or coalition) to undermine assignment by joint action.
 - an unmatched pair (m,w) is **UNSTABLE** if man m would prefer woman w to his wife, and w would prefer m to her husband
 - unstable pair could each improve by dumping spouses and eloping

STABLE MARRIAGE = perfect matching with no unstable pairs.
(Gale and Shapley, 1962)

Example

Men's Preference List

Woman	0 th	1 st	2 nd
Xavier	A	B	C
Yancey	B	A	C
Zeus	A	B	C

Women's Preference List

Woman	0 th	1 st	2 nd
Amy	Y	X	Z
Bertha	X	Y	Z
Clare	X	Y	Z

Lavender assignment is a perfect matching.
Is it stable?

Example

Men's Preference List

Woman	0 th	1 st	2 nd
Xavier	A	B	C
Yancey	B	A	C
Zeus	A	B	C

Women's Preference List

Woman	0 th	1 st	2 nd
Amy	Y	X	Z
Bertha	X	Y	Z
Clare	X	Y	Z

Green assignment is a stable matching.

Example

Men's Preference List

Woman	0 th	1 st	2 nd
Xavier	A	B	C
Yancey	B	A	C
Zeus	A	B	C

Women's Preference List

Woman	0 th	1 st	2 nd
Amy	Y	X	Z
Bertha	X	Y	Z
Clare	X	Y	Z

Orange assignment is also a stable matching.

Stable Roommate Problem

Not obvious that stable marriage exists.

Consider related “stable roommate problem.”

- 2N people.
- Each person ranks others from 0 to 2N-2.
- Assign roommate pairs so that no unstable pairs.

Preference List			
	0 th	1 st	2 nd
Adam	B	C	D
Bob	C	A	D
Chris	A	B	D
Doofus	A	B	C

No perfect matching is stable.

For all 3 possible perfect marriage, can always find unstable pair.

E.g., A-C forms unstable pair in lavender marriage.

Existence

Surprising Fact:

- Unlike for stable roommate problem, one (or more) stable marriages exist for any input to problem.

How do we find one?

- Are there others?
- Which one is best for Zeus?
- Is there one that is best for all the men collectively? All the women?

Propose-And-Reject Algorithm

Formal (and intuitive) method that guarantees to find a stable marriage.

Repeat until no unmatched men

- An unmatched man m proposed to his favorite woman w to whom he has not already proposed.
- If w is unmatched, she accepts proposal from m (but can later dump him).
- Otherwise, if w prefers her current fiancé to m , she reject m outright.
- Otherwise, if she prefers m to her current fiancé, she dumps her fiancé and accepts the proposal from m .



Demo

Why Does Algorithm Work?

Observation 1. Men propose to their favorite women first.

Observation 2. Once a woman is matched, she never becomes unmatched. She only “trades up.”

Fact 1. All men and women get matched.

- Suppose upon termination Zeus is not matched.
- Then some woman, say Amy, is not matched upon termination.
- By Observation 2, Amy was never proposed to.
- But, Zeus proposes to everyone, since he ends up unmatched. (contradiction)

Why Does Algorithm Work?

Observation 1. Men propose to their favorite women first.

Observation 2. Once a woman is matched, she never becomes unmatched. She only “trades up.”

Fact 2. No unstable pairs.

- Suppose Zeus-Amy is an unstable pair, i.e., each prefers each other to spouse. (Zeus-Bertha, Yancy-Amy)
- Case 1. Zeus never proposed to Amy.
 - ⇒ Zeus must prefer Bertha to Amy (Observation 1)
 - ⇒ Zeus-Amy is stable. (contradiction)
- Case 2. Zeus proposed to Amy.
 - ⇒ Amy rejected Zeus (right away or later)
 - ⇒ Amy prefers Yancy to Zeus (women only trade up)
 - ⇒ Zeus-Amy is stable (contradiction)

Pseudocode

```
int marriages = 0;
while (marriages < N)
    find unmatched man m

    while (m unmatched)
        let w be man m's favorite women to
        whom he has not yet proposed

        if (w unmatched)
            m and w get engaged
            marriages++;
            break;

        if (w prefers m to current fiancé f)
            f now unmatched
            m and w get engaged
            break;

    else w rejects m
```

How to Represent Men and Women

Represent men and women as integers between 0 and N-1.

- 0 through N-1 since C array indices start at 0.
- Could use `struct` if we want to carry around more information, e.g., name, age, astrological sign.

How to Represent Marriages

Use array to keep track of marriages.

$$\text{wife}[m] = \begin{cases} w & \text{if man } m \text{ matched to woman } w \\ -1 & \text{if man } m \text{ unmatched} \end{cases}$$

$$\text{husb}[w] = \begin{cases} m & \text{if man } m \text{ matched to woman } w \\ -1 & \text{if woman } w \text{ unmatched} \end{cases}$$

```
int wife[N];
int husb[N];

for (m = 0; m < N; m++)
    wife[m] = -1;
for (w = 0; w < N; w++)
    husb[w] = -1;
```

Filling in Some of the Code

find unmatched man

while (m unmatched)

if (w unmatched)
m and w get engaged

f = current fiancé of w
f now unmatched
m and w get engaged

```
while (marriages < N)
    for (m = 0; wife[m] != -1; m++)
        ;
    while (wife[m] == -1)
        let w be man m's favorite women to
        whom he has not yet proposed
        if (husb[w] == -1)
            husb[m] = w;
            wife[m] = w;
            marriages++;
            break;
        if (w prefers m to current fiancé f)
            f = husb[w];
            wife[f] = -1;
            husb[m] = w;
            wife[w] = m;
            break;
```

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Representing the Preference Lists

Use 2D-array to represent preference lists.

- 2D-array is array of arrays.
- $mp[m][i] = w$ if man m 's i th favorite woman is w .
- $wp[w][i] = m$ if woman w 's i th favorite man is m .

Men's Preference List

Man	0th	1st	2nd	3rd	4th
0	1	0	3	4	2
1	3	1	0	2	4
2	1	4	2	3	0
3	0	3	2	1	4
4	1	3	0	4	2

$mp[1][0] = 3$
man 1 likes woman 3 the best

```
int mp[N][N];
int wp[N][N];
```

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Initializing the Preference Lists

Could read from stdin.

We'll assign random lists for each man and woman.

- Use `randomPermutation` function from last time.
- Need N random permutations for men, and N for women.

```
int mp[N][N];
int wp[N][N];

for (m = 0; m < N; m++)
    randomPermutation(mp[m]);

for (w = 0; w < N; w++)
    randomPermutation(wp[w]);
```

$mp[m]$ is man m 's preference list array.

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Dumping

Does woman $w=2$ prefer man $m_1=3$ to man $m_2=0$?

search preference list sequentially until m_1 or m_2 found

Women's Preference List

Woman	0th	1st	2nd	3rd	4th
0	4	0	1	3	2
1	2	1	3	0	4
2	1	2	3	4	0
3	0	4	3	2	1
4	3	1	4	2	0

```
for (i = 0; i < N; i++) {
    if (wp[w][i] == m1) YES
    if (wp[w][i] == m2) NO
}
```

TOO SLOW if N is large, since need to repeat many times.

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Keeping Track of Men's Proposals

Unmatched man proposes to most favorable woman to whom he hasn't already proposed.

How do we keep track of which woman a man has proposed to?

- Men propose in decreasing order of preference.
- Suffices to keep track of number of proposals in array.

`propose[m] = i` if man `m` has proposed to `i` woman already.

initialize array

```
int props[N];
for (i = 0; i < N; i++)
    props[i] = 0;
```

find next woman to propose to

```
for (;;) {
    w = mp[m][props[m]];
    props[m]++;
    . . .
}
```

`props[m]` is next woman on preference list

make next proposal to woman `mp[m][props[m]]`

Try Out The Code

marriage.c

```
#include <stdio.h>
#include <stdlib.h>
#include <assert.h>
#define N 500

int main(void) {
    int mp[N][N]; /* mp[m][i] = w if man m's ith favorite woman is w */
    int wp[N][N]; /* wp[w][i] = m if woman w's ith favorite man is m */
    int wife[N]; /* wife[m] = w if m married to w */
    int husb[N]; /* husb[w] = m if m married to w */
    int props[N]; /* props[m] = i if man m has proposed to i women */

    int marriages = 0; /* number of couples matched so far */
    int m, w;

    /* initialize men */
    for (m = 0; m < N; m++) {
        props[m] = 0;
        wife[m] = -1;
        randomPermutation(mp[m], N);
    }

    /* initialize women */
    for (w = 0; w < N; w++) {
        husb[w] = -1;
        randomPermutation(wp[w], N);
    }
}
```

Try Out The Code

marriage.c

```
while (marriages < N) {
    /* find first unmatched man */
    for (m = 0; m < N; m++)
        if (wife[m] == -1) break;

    printf("man %d proposing:\n", m);
    /* propose to next women on list until successful */
    for (;;) {
        w = mp[m][props[m]];
        printf(" to woman %d", w);
        props[m]++;

        /* woman w unmatched */
        if (husb[w] == -1) {
            printf(" accepted\t(woman %d previously unmatched)\n", w);
            husb[w] = m; wife[m] = w;
            marriages++;
            break;
        }

        /* woman w prefers m to current mate */
        if (wr[w][m] < wr[w][husb[w]]) {
            printf(" accepted\t(woman %d dumps man %d)\n", w, husb[w]);
            wife[husb[w]] = -1;
            husb[w] = m; wife[m] = w;
            break;
        }
        /* otherwise m rejected by w */
        printf(" rejected\t(woman %d prefers %d)\n", w, husb[w]);
    }
}
```

Try Out The Code

Unix

marriage.c

```
printf("Stable matching\n");
for (m = 0; m < N; m++)
    printf("%5d %5d\n", m, wife[m]);

return 0;
}
```

```
% gcc marriage.c
% a.out

man 0 proposing:
  to woman 4 accepted (woman 4 previously unmatched)
man 1 proposing:
  to woman 0 accepted (woman 0 previously unmatched)
man 2 proposing:
  to woman 2 accepted (woman 2 previously unmatched)
man 3 proposing:
  to woman 2 rejected (woman 2 prefers 2)
  to woman 3 accepted (woman 3 previously unmatched)
man 4 proposing:
  to woman 2 accepted (woman 2 dumps man 2)
man 2 proposing:
  to woman 3 accepted (woman 3 dumps man 3)
man 3 proposing:
  to woman 0 rejected (woman 0 prefers 1)
  to woman 4 rejected (woman 4 prefers 0)
  to woman 1 accepted (woman 1 previously unmatched)
```

```
Stable matching
0 4
1 0
2 3
3 1
4 2
```

Observation: code is REALLY slow for large N.

An Auxiliary Data Structure

Create a 2D array that stores men's ranking of women.

- $mr[m][w] = i$ if man m 's ranking of woman w is i .
- $wr[w][m] = i$ if woman w 's ranking of man m is i .

Men's Preference List

Man	0th	1st	2nd	3rd	4th
0	1	0	3	4	2
1	3	1	0	2	4
2	1	4	2	3	0
3	0	3	2	1	4
4	1	3	0	4	2

Men's Rankings

Man	0	1	2	3	4
0	1 st	0 th	4 th	2 nd	3 rd
1	2 nd	1 st	3 rd	0 th	4 th
2	4 th	0 th	2 nd	3 rd	1 st
3	0 th	3 rd	2 nd	1 st	4 th
4	2 nd	0 th	4 th	1 st	3 rd

$mp[1][0] = 3$
man 1 likes woman 3 best

$mr[1][3] = 0$
man 1 likes woman 3 best

An Auxiliary Data Structure

Create a 2D array that stores men's ranking of women.

- $mr[m][w] = i$ if man m 's ranking of woman w is i .
- $wr[w][m] = i$ if woman w 's ranking of man m is i .

Does man $m = 3$ prefer woman $w_1 = 2$ to woman $w_2 = 4$?

```
if (mr[m][w1] < mr[m][w2])
    YES
else NO
```

Men's Rankings

Man	0	1	2	3	4
0	1 st	0 th	4 th	2 nd	3 rd
1	2 nd	1 st	3 rd	0 th	4 th
2	4 th	0 th	2 nd	3 rd	1 st
3	0 th	3 rd	2 nd	1 st	4 th
4	2 nd	0 th	4 th	1 st	3 rd

$mr[m][w1] = 2$
 $mr[m][w2] = 4$

Check if Marriage is Stable

Check if $husb[N]$ and $wife[N]$ correspond to a stable marriage.

- Good warmup and useful for debugging.
- Check every man-woman pair to see if they're unstable.
- Use ranking arrays.

```

isStable
int isStable(int husb[], int wife[],
             int mr[N][N], int wr[N][N]) {
    int m, w;
    for (m = 0; m < N; m++)
        for (w = 0; w < N; w++)
            if (mr[m][w] < mr[m][wife[m]] &&
                (wr[w][m] < wr[w][husb[w]]))
                return 0;
    return 1;
}
    
```

← m prefers w to current wife

↑ w prefers m to current husband

Check if Marriage is Stable

Check if $husb[N]$ and $wife[N]$ correspond to a stable marriage.

- Good warmup and useful for debugging.
- Check every man-woman pair to see if they're unstable.
- Use ranking arrays.

Time/space tradeoff for using auxiliary ranking arrays.

- Disadvantage: requires twice as much memory (storage).
- Advantage: dramatic speedup in running time (using 400 MHz Pentium II with $N = 10,000$).



Men vs. Women

Given input, there may be several stable marriages. Which one does algorithm find?

Fact 3. Propose-and-reject algorithm is MAN-OPTIMAL!

- Simultaneously best for each and every man.
- There is no stable marriage in which any single man individually does better.

Fact 4. Propose-and-reject algorithm is WOMAN-PESSIMAL.

- Simultaneously worst for each and every woman.
- There is no stable marriage in which any single woman individually does worse.

Fact 5. The man-optimal stable matching is weakly Pareto optimal.

- In every other matching (stable or unstable), at least one man does strictly worse.

Extensions

Yeah, but In real-world every woman is not willing to marry every man, and vice versa?

- Some participants declare others as “unacceptable” (prefer to be alone than with given partner).
- Algorithm extends to handle partial preference lists.

Also, there may be an unequal number of men and women.

- E.g., 150 men, 100 women.
- Algorithm extends.

What about limited polygamy?

- E.g., Bill wants 3 women.
- Algorithm extends.

Application

Matching medical school residents to hospitals. (NRMP)

- Hospitals ~ Men (limited polygamy allowed).
- Residents ~ Women.
- Original use just after WWII (predates computer usage).
- Ides of March, 13,000+ residents.

Rural hospital dilemma.

- Certain hospitals (mainly in rural areas) were unpopular and declared unacceptable by many residents.
- Rural hospitals were under-subscribed in NRMP matching.
- How can we find stable matching that benefits “rural hospitals”?

Rural Hospital Theorem:



Deceit: Machiavelli Meets Gale-Shapley

Is there any incentive for a participant to misrepresent his/her preferences?

- Assume you know men’s propose-and-reject algorithm will be run.
- Assume that you know the preference lists of all other participants.

Fact 6.



Deceit: Machiavelli Meets Gale-Shapley

Is there any incentive for a participant to misrepresent his/her preferences?

Fact 7.



Men's Preferences

	0 th	1 st	2 nd
Xavier	A	B	C
Yancy	B	A	C
Zeus	A	B	C

Women's Preferences

	0 th	1 st	2 nd
Amy	Y	X	Z
Bertha	X	Y	Z
Clare	X	Y	Z

Amy lies.

	0 th	1 st	2 nd
Amy	Y	Z	X
Bertha	X	Y	Z
Clare	X	Y	Z

Lessons Learned

Powerful ideas learned in COS 126.

- Combine to obtain neat and useful algorithms.

