# Assortative Matching with Externalities and Farsighted

## **Agents**

Kenzo Imamura<sup>y</sup>

Hideo Konishi<sup>z</sup>

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#### Abstract

We consider a one-to-one assortative matching problem in which matched pairs compete for a prize. With such externalities, the standard solution concept, pairwise stable matching, may not exist. In this paper, we consider farsighted agents and analyze the largest consistent set (LCS) of Chwe (1994). Despite the assortative structure of the problem, LCS tend to be large with the standard exectiveness functions: LCS can be the set of all matchings, including an empty matching with no matched pair. By modifying the exectiveness function motivated by Knuth (1976), LCS becomes a singleton of the positive assortative matching. Our results suggest that the choice of exectiveness function can signi...cantly impact the solution in a matching problem with externalities.

Keywords: group contest, pairwise stable matching, assortative matching, farsightedness, largest consistent set, exectiveness function

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<sup>y</sup>The University of Tokyo Market Design Center, (email) i mamurak@e. u-tokyo. ac. jp

### 1 Introduction

There is a large literature on two-sided matching problems after a celebrated paper by Gale and Shapley (1962). The structures and the properties of its central solution concept, pairwise stable matching, have been investigated extensively. At the same time, relatively little attention has been paid to matching problems with externalities, despite their ubiquity in many matching markets in the real world. For instance, matched pairs compete after a matching is formed. In this case,

Consider the following example. Suppose that there are three male and three female skaters with high, medium, and low ability. It is natural to predict a positive assortative matching as an outcome of this example. Is it pairwise stable under the above exectiveness function? Consider a deviation by the high ability male and the medium ability female skaters from the assortative matching. Then, according to the exectiveness function, their former partners, the high ability female and the medium ability male, cannot participate in the pairs competition, since they become singles. This means that there are only two pairs in the competition, and the deviating pair gets a high winning probability against the low ability pair. Thus, in the presence of externalities, there may not be a pairwise stable matching under the standard exectiveness function.

When the high ability male and the medium ability female agents deviate, they do not expect any reaction from their former partners. Since single agents cannot participate in the pairs contest, it is bene...cial to match with any available partner. Given the two singles dumped by their partners are available to form a pair, it is probably not reasonable for the deviating pair to expect their deviation to decrease the number of pairs. Thus, it is natural to investigate whether or not agents'

#### 1.1 Literature Review

There are three branches of literature are related to our paper. The ..rst branch is the matching problem with externalities.<sup>5</sup> Recently, a number of papers have been written in this ..eld. Sasaki and Toda (1996) was the ..rst to analyze a one-to-one matching problem with externalities. They considered a set of admissible matchings which can be realized after a pair is formed (or deviates), and de..ned pairwise stable matching, assuming that deviating pairs expect the worst case scenario. They showed that the admissible set needs to be the set of all matchings to ensure the existence of a stable matching, and proved that there always exists a Pareto-e¢ cient stable matching. Hafalir (2007) imposed certain rationality constraints on players' expecting which set of matchings might be realized by forming a pair, and showed the existence of stable matching under pessimism as in Sasaki and Toda (1996). Chen (2019) considered a speci...c example of Cournot oligopoly game played by joint ventures, assuming that each pair has unique expectation on the realization of a matching if it is formed. With this list of expectations for each possible pair, each player chooses his/her partner and Chen de..ned a stable matching as the outcome of this game. Chen identi..ed conditions under which positively and negatively assortative matchings are stable. Mumcu and Saglam (2010) introduced outside options, and Fisher and Hafalir (2016) and Chade and Eeckhout (2020) avoided the impacts of pairwise deviations through externalities by imposing a behavioral assumption and by considering a continuum of atomless agents, respectively. Bando (2012, 2014) and Pycia and Yenmez (2021) considered one-to-many and many-to-many matchings, and analyzed the standard stability concept and its existence by imposing assumptions on agents' preferences.

Second is the ..eld of farsighted stability. Mauleon, Vannetelbosch, and Vergote (2011), Herings, Mauleon, and Vannetelbosch (2020), and Kimya (2021) considered farsighted agents in one-to-one matching problems without externalities. The ..rst two papers showed that every farsighted

<sup>&</sup>lt;sup>5</sup>More generally, there is a large literature of theory of coalition formation with externalities, starting from Hart and Kurz (1983). For surveys from various aspects, see Bloch (1997), Ray (2008), and Ray and Vohra (2014).

stable set is a singleton set of a stable matching under coalitional and pairwise exectiveness functions, respectively. Kimya (2021) showed that the largest maximal farsighted set in the spirit of Dutta and Vartiainen (2020) coincides with LCS by Chwe (1994) in this domain with coalitional deviations. We consider farsighted agents in the pairs competition model with externalities in this paper, and show that the choice of exectiveness function matters, providing an example where LCS, under the standard exectiveness function, is the set of all matchings, including a fully unmatched matching.

Third, our paper belongs to the literature of assortative matching. Becker (1973) introduced the assortative model of marriages. Banerjee, Konishi, and Sönmez (2001) extended Becker's assortative matching problem to hedonic coalition formation problems without externalities by de..ning a top coalition property. This property guarantees the existence and uniqueness of the core. Diamantoudi and Xue (2003) proved that under the top coalition property, LCS coincides with a singleton core under the standard exectiveness function in coalition formation problems. Mauleon, Vannetelbosch, and Vergote (2011) derived the same result in the context of one-to-one matching. Although our model has the same assortative structure, the results are quite dixerent with externalities.

### 2 The Model

We ..rst de..ne our one-to-one matching problem with externalities, and introduce basic terminologies in the next subsection, then we move on to introduce (..gure skating) pairs competition problem.

<sup>&</sup>lt;sup>6</sup>Dutta and Vartiainen (2020) introduced history dependence to the rational expectations farsighted stability in Dutta and Vohra (2017) to assure nonemptiness of solutions for all ...nite problems.

<sup>&</sup>lt;sup>7</sup>See Bogomolnaia and Jackson (2002) and Leo et al. (2021) as well.

#### 2.1 One-to-One Matching Problems with Externalities

Let  $M = fm_1; ...; m$  g and  $W = fw_1; ...; w$  g be the sets of male and female agents with jMj = jWj = n. Let  $: M [ W ! M [ W be a one-to-one matching: ( (x)) = x for all x 2 M [ W such that if (m) <math>\in$  m then (m) 2 W, and if (w)  $\in$  w then (w) 2 M. The set of all matchings is denoted by M. Each agent x 2 M [ W has a complete, transitive, and retexive preference relation R which is a binary relation over M. Let the associated strict preference relation be P ( R and : R ), and associated indimerence relationship be I ( R and R ). A matching is fully matched if (x)  $\in$  x for all x 2 M [ W. Denote a set of all fully matched matchings by M . A matching is a fully unmatched matching if (x) = x for all x 2 M [ W.

We de...ne an exectiveness function which describes the resulting matching induced by a deviation from the original matching. The following exectiveness function is standard in the literature of matching theory and coalition formation (Roth and Vande Vate, 1990; Diamantoudi and Xue, 2003; Herings, Mauleon, and Vannetelboch, 2020).

De...nition 1. A matching is induced from by a pair (m; w) 2 M W, denoted by ! ( ) , if it holds

- (i) (m)  $\in$  w and (m) = w;
- (ii)  $(m) \notin m$ ) ((m)) = (m) and  $(w) \notin w$ ) ((w)) = (w);
- (iii) for all  $x \ge M$  [ W n fm; w; (m); (w)g, (x) = (x):

In words, the exectiveness function states that when a pair of agents deviates from a matching, the resulting matching is identical to the original matching except that (1) deviators are matched, and (2) their previous partners are single. Similarly, we can de...ne the exectiveness function for a deviation by an agent.

De...nition 2. A matching is induced from by an agent x 2 M [ W, denoted by ! if it holds

(i) (x)  $\in$  x and (x) = x;x

pair i's winning probability is given by

$$= \frac{\mathsf{Y}}{\mathsf{Y}} : \tag{1}$$

The expected payoxs of agent x in pair i is  $\frac{1}{2}$ 

$$U = e + a_{x()};$$

where  $a_{x(\cdot)}$  is agent x's payo¤ from the partner's ability, and > 0 is su¢ ciently small. This is introduced to break ties when there is only one pair in the competition: agent x in the pair prefers a high ability partner even though he/she wins with probability one without making e¤ort. Thus, in the pairs competition problem, for every agent x, preference P satis…es

(i) for all

n( ) jN( )j is the number of matched pairs under ;

A ( ) 
$$a_{i}^{-} + a_{x(-i)}^{-}$$
 is the productivity of pair i 2 N( ).

Pair i's equilibrium winning probability is calculated as<sup>10</sup>

$$= 1 \frac{(n(\ )\ 1) \frac{1}{i(x)}}{=1 \frac{1}{j(x)}}$$
:

Member x of pair i's equilibrium payo¤ under when (x) € x can be explicitly solved as 11

$$U = 1 \frac{(n(\ ) \ 1) \frac{1}{\frac{1}{(x)}}}{(x) \frac{1}{\frac{1}{y}(x)}} \quad 1 \quad \frac{(n(\ ) \ 1) \frac{1}{\frac{1}{(x)}}}{(x) \frac{1}{\frac{1}{y}(x)}} \quad \frac{a}{A(\ )} \quad + a_{x(\ )}$$
winning probability
net bene its by taking exert disjutility into account.

Since agent x cannot control a , we can write U as:

$$U = V (A (); E()) + a_{x()};$$

where E() is an aggregated externalities index under

E() 
$$\frac{(x)^{\frac{1}{j}(x)}}{n()}$$
:

Note that when agent x gets a higher ability partner, payox U increases due to increases in both A ( ) and E( ).

It is important to mention two properties of the aggregated externality index E(). First, E() tends to decrease in the number of matched pair n(). This is because assuming that is the average value of  $\frac{1}{j(x)}$ ,  $\frac{1}{j(x)}$ , stays constant,  $\frac{(x)}{(x)-1}$  decreases as n() goes up. This externality causes an important dixerence between the standard matching problem and the one without externalities. The following example mentioned in the introduction illustrates that.

<sup>&</sup>lt;sup>10</sup> For the detailed derivations, see Imamura, Konishi, and Pan (2021); Konishi, Pan, and Simeonov (2021).

<sup>&</sup>lt;sup>11</sup>We can show that if  $\frac{n}{j=1}\frac{1}{A_j(\cdot)} > (n(\cdot)-1)\frac{1}{A_i(\cdot)}$  for all i=1; ...; n, then every pair gets a positive winning probability, see Imamura, Konishi, Pan (2021); Konishi, Pan, and Simeonov (2021) for the details. This condition is satis...ed for any 2 M if  $\frac{n}{j=1}\frac{1}{n-1}$ 

Example 1. (Imamura, Konishi, and Pan, 2021) Consider a pairs competition problem with  $M=fm_1; m_2; m_3g$  and  $W=fw_1; w_2; w_3g$ . Let  $a_{-1}=a_{-1}=1$ ,  $a_{-2}=a_{-2}=0.9$ , and  $a_{-3}=a_{-3}=0.7$ . Set  $=\frac{1}{2}$ , then we have  $Y=(a^{\frac{1}{2}}_{-1}e^{\frac{1}{2}}_{-1}+a^{\frac{1}{2}}_{x(-1)})^2$  and  $A=a_{-1}+a_{x(-1)}$ . For simplicity set  $=0.^{12}$  We calculate  $m_1$ 's payomaxs under the positive assortative matching and matching with  $\frac{1}{1-2}$ .

(i) =  $f(m_1; w_1); (m_2; w_2); (m_3; w_3)g$ :

$$U_{1}() = 1 \frac{2 \frac{1}{2}}{\frac{1}{2} + \frac{1}{18} + \frac{1}{14}} 1 \frac{2 \frac{1}{2}}{\frac{1}{2} + \frac{1}{18} + \frac{1}{14}} \frac{1}{2} = 0:31209$$

(ii) =  $f(m_1; w_2); (m_3; w_3)g$ :

$$U_{1}() = 1 \quad \frac{\frac{1}{19}}{\frac{1}{19} + \frac{1}{14}} \quad 1 \quad \frac{\frac{1}{19}}{\frac{1}{19} + \frac{1}{14}} \quad \frac{1}{1:9} = 0:44720$$

Thus,  $m_1$  is better ox by dumping his superior partner for an inferior partner. For any other fully matched matching  $2\ M$ , a similar deviation blocks . In addition, for any matching , and a

Lemma 1. (Imamura, Konishi, and Pan, 2021) Let  $\ , \ m \ ; \ m \ 2 \ M \ with \ < k \ (thus a > a_k),$  and  $\ (m); \ (m) \ 2 \ W \ with \ a((m)) < a((m)).$  Let be such that  $\ (m) = (m)$  and  $\ (m) = (m)$  with  $\ (x) = (x)$  for all other x by swapping the partners among these two pairs. Then, E() > E() holds.

One important implication of Lemma 1 is that higher ability agents m and (m) are better ox by the above assortative swapping, since the abilities of their partners improve. We use these properties to analyze LCS in the next section.

#### 3 The Results

#### 3.1 LCS under the Standard Exectiveness Function

In this section, we consider farsighted agents and analyze the largest consistent set (LCS) introduced by Chwe (1994). We begin by providing a few concepts to de..ne LCS.

De...nition 3. A matching is indirectly dominated by if there is a ...nite sequence of distinct matchings  $_0$ ; ...; with  $_0$  = and = such that for every I 2 f0; ...; L 1g; !  $_{+1}$  holds for some S 2 M [ W [ M W such that P for x 2 S. We denote this indirect domination by .

De..nition 4. A set of matchings CS(M) M is consistent if for all 2CS(M), all induced by deviation ! for some S2M[W[M]W, there exist  $\sim 2CS(M)$  such that  $\sim$ , and  $\times 2S$  with :  $\sim P$ .

De...nition 5. A set of matchings LCS(M) M is the largest consistent set if it is consistent and contains all consistent set C(M) LCS(M).

Denote the positive assortative matching by  $\ \ , \ \$  where  $\ \ \ \ \$  (m ) = w for all k = 1; :::; n. In pairs competition problems, satis...es the following property.

Lemma 2. (1) For all 2 M with  $6 , P_1$  and  $P_1$  hold, and (2) for all k = 2; ...; n = 1, and all 2 M such that (i) (m) = w for all j = 1; ...; k = 1, and (ii) (m) 6 w, if 6 then  $P_k$  and  $P_k$  hold.

Proof. Suppose that  $2\ M$  and 6. Then, there is k such that  $(m)\ 6\ W$ . Let the smallest of such k, and name it k. Then,  $(m)\ =\ W$  holds for all j=1;...;k 1, and  $a_{x(-k)}< a_{-k}$  and  $a_{x(-k)}< a_{-k}$ . Consider a deviation by assortative swapping  $\Rightarrow_{(-k-k)}$ . Since  $2\ M$ ,  $2\ M$  holds. By Lemma 1, we have  $P_{-k}$  and  $P_{-k}$ , and  $P_{-j}$  and  $P_{-j}$  for all j=1;...;k 1. Now, suppose that 6. By the same argument, there is the smallest 00 k with 01 k W. Consider assortative swapping 02 k with 03 k West 04 and 05 k West 05 k West

Due to the assortative structure, one might think that LCS is a singleton of the assortative matching f g. However, the other direction of inclusion relationship does not hold in the model with externalities: LCS includes not only , but also many other matchings. Perhaps surprisingly, LCS in Example 1 coincides with the set of all matchings M, including the empty matching.

Proposition 2. In Example 1, LCS(M) = M.

To prove the above statement, we introduce some notations. Let the sets of matchings with three, two, one, and zero pairs be  $M^3 = f \ 2 M : jfx \ 2 M \ [W : (x) = xgj = 0g, M^2 = f \ 2 M : jfx \ 2 M \ [W : (x) = xgj = 2g, M^1 = f \ 2 M : jfx \ 2 M \ [W : (x) = xgj = 4g, and M^0 = f \ 2 M : jfx \ 2 M \ [W : (x) = xgj = 6g, respectively.$ 

For use later, we calculate m<sub>1</sub>'s payo ¤s under a few relevant matchings:

(i) 
$$_1 = f(m_1; w_1); (m_2; w_2); (m_3; w_3)g$$
:

$$U_{1}(1) = 1 \quad \frac{2 \quad \frac{1}{2}}{\frac{1}{2} + \frac{1}{18} + \frac{1}{14}} \quad 1 \quad \frac{2 \quad \frac{1}{2}}{\frac{1}{2} + \frac{1}{18} + \frac{1}{14}} \quad \frac{1}{2} = 0:31209$$

(ii)  $_2 = f(m_1; w_3); (m_2; w_1)g$ :

$$U_{1}(2) = 1 \frac{\frac{1}{17}}{\frac{1}{17} + \frac{1}{19}} 1 \frac{\frac{1}{17}}{\frac{1}{17} + \frac{1}{19}} \frac{1}{1:7} = 0:32562$$

(iii)  $_3 = f(m_1; w_1); (m_2; w_2)g:$ 

$$U_{1}(_{3}) = 1 \quad \frac{\frac{1}{2}}{\frac{1}{2} + \frac{1}{18}} \quad 1 \quad \frac{\frac{1}{2}}{\frac{1}{2} + \frac{1}{18}} \quad \frac{1}{2} = 0:40166$$

(iv)  $_{4} = f(m_{1}; w_{2}); (m_{2}; w_{3})g:$ 

$$U_{1}(4) = 1 \frac{\frac{1}{19}}{\frac{1}{19} + \frac{1}{16}} 1 \frac{\frac{1}{19}}{\frac{1}{19} + \frac{1}{16}} \frac{1}{1:9} = 0:41224$$

Naturally, we assume U ( ) = 0 for all x 2 M [ W if 2  $M^0$ . We also assume that if 2  $M^1$ , the pair wins with probability 1, but agents still slightly prefer a partner with higher

In this particular example, we can also show through direct calculation that for all  $2 M^2$ , all  $2 M^3$ , and all x with  $(x) \in x$  (and  $(x) \in x$ ), P holds. The calculations show that U  $_1(_1) < U _1(_2)$  holds even though  $_1$  is the most preferable matching in  $M^3$  for  $m_1$  and  $_2$  is the least preferable in  $M^2$  for  $m_1$ . We write down this property formally.

Strong Negative Externalities in Size (SNES). Suppose that (i)  $2 M^1$  and  $2 M^2 [M^3, or (ii) 2 M^2]$  and  $2 M^3$ . If for all x 2 M [W] with  $(x) \in x$  and  $(x) \in x$ ,  $(x) \in x$ , (x)

With SNES, we can show the following claim.

Claim. In Example 1,  $M^1$  [  $M^2$  [  $M^3$  is consistent.

Proof.

 $2 \, M^1$ , then there is  $2 \, M^2$  with by matching a pair excluding the original deviator. Clearly, the original deviator does not bene...t. If a deviation pair creates  $2 \, M^2$ , then there is  $2 \, M^3$  with by matching two single agents. By SNES, the original deviation is not pro...table. If a deviation (m; w) creates  $2 \, M^3$  by matching two single agents, then w can deviate with m

### 3.2 LCS under the Knuth Exectiveness Function

We consider the exectiveness function introduced by Knuth (1976) in this section. In our problem, unmatched agents get the lowest payox of zero, since he/she cannot participate in the contest.

Diamantoudi and Xue (2003) showed that if a hedonic game satis...es the top-coalition property, then LCS is the singleton core, which is the assortative matching in the one-to-one matching problem without externalities. Does the same result hold in our problem under the exectiveness function with swapping? The following proposition shows that the answer is a¢ rmative.

Proposition 3. In the pairs competition problem, LCS under exectiveness function  $\Rightarrow$  only includes :i.e., LCS (M) = f g.

Proof. First notice LCS (M) M. If has unmatched singles, any unmatched pair (m; w) can deviate from to obtain positive payoxs. Since both m and w will have partners under exectiveness function x, after the deviation they retain positive payoxs, regardless of subsequent deviations. Since m and w obtain zero payoxs from matching , they certainly deviate from . Thus, x LCS (M), and we conclude LCS (M) M.

Now, we will prove LCS (M) = f g. First, we prove the following claim.

Claim. For all 2 LCS (M), we have  $(m_1) = w_1$ .

Proof of Claim. Consider a set of full matchings in which  $m_1$  and  $w_1$  are not matched:  $M_1$  f  $2 M_1$ :  $(m_1) \in w_1g$ . This is a ..nite set, and the elements of  $M_1$ ,  $m_1$ ; ...; can be ordered

By the same argument, we conclude M  $_2 \setminus LCS$  (M ) = ;. So, we move on to M  $_3$  f 2 M :  $(m_1) = w_1$ ;  $(m_2) = w_2$  and  $(m_3) \notin w_3g$ , and so on. This proves that only remains in LCS (M). We completed the proof.

## 4 Concluding Remarks

In this paper, we analyzed farsighted agents in a one-to-one matching problem with externalities and the assortative structure. In the matching problem without externalities of Becker (1973), the assortative matching is a quite robust prediction irrespective of pairwise or coalitional deviations and the choice of exectiveness function. However, with externalities, we showed that the choice of exectiveness function is crucial: LCSa29(i)6ities, we see s8810(n)12912(r)s8811(7)10(3)936(k)39(e)91(3)9(

solution concept for farsighted agents. The farsighted stable set—vNM stable set de...ned by indirect domination—have been extensively investigated in the recent literature. It is easy to see that the singleton set of the assortative matching f g is a farsighted stable set in our problem since indirectly dominates any other matchings. The question is whether or not this is the unique farsighted stable set in the pairs competition problem. Harsanyi's (1974) indirect domination requires every coalition participating in the chain reaction of proposals and counter-proposals to

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