## Problem Set #3

This problem set is due at the start of class on Thursday, March 29th.

Fix an instance of the assignment game with m buyers and n sellers, and where all of the  $\alpha_{i,j}$  values are integers. As a technical convenience, we assume that the set of buyers includes n buyers i such that  $\alpha_{i,j} = 0$  for each item j. (These buyers may be viewed as dummy buyers; we will use them to ensure that there is a stable assignment in which every item is assigned to a buyer.)

Let  $p^*$  denote the minimum (i.e., buyer-optimal) stable price vector for this instance. In the lecture we saw how to use the (incremental) Hungarian algorithm to compute  $p^*$ . In this problem set, we analyze another method for computing  $p^*$ . For any price vector p, and any buyer i, we define gap(p, i) as the maximum, over all items j, of  $\alpha_{i,j} - p_j$ . Given any price vector p, let yes(p) denote the set of all buyers i such that gap(p, i) > 0, let maybe(p)denote the set of all buyers i such that gap(p, i) = 0, and let no(p) denote the set of all buyers i such that gap(p, i) < 0.

For any buyer *i*, we define demand(p, i) as the set of all items *j* such that  $\alpha_{i,j} - p_j = \max\{0, gap(p, i)\}$ . For any set of items *S*, we define confined(p, S) as the set of all buyers *i* in yes(p) such that demand(p, i) is contained in *S*. [NOTE ADDED 3/16/12: In the original version of the problem set, I had erroneously written "belongs to *S*" at the end of the previous sentence, rather than "is contained in *S*".] We define *overdemanded(p)* as the collection of all sets of items *S* such that |confined(p, S)| > |S|. We define a subset of *overdemanded(p)*, denoted *minimal(p)*, as follows: A set *S* in *overdemanded(p)* belongs to *minimal(p)* if no proper subset of *S* belongs to *overdemanded(p)*.

For any set of items S, we define interested(p, S) as the set of all buyers i such that  $demand(p, i) \cap S$  is nonempty.

- 1. Let p be a price vector such that  $p \leq p^*$  (i.e, for any item  $j, p_j \leq p_j^*$ ), let S be a set of items in minimal(p), and let p' denote the price vector that is obtained from p by incrementing the prices of all items in S (i.e., for each item j in S,  $p'_j = p_j + 1$ , and for each item j that does not belong to S,  $p'_j = p_j$ ). Prove that  $p' \leq p^*$ .
- 2. Consider the following nondeterministic algorithm  $\mathcal{A}$  for computing a price vector p. Start by initializing p to the all-zeros vector. Then, while overdemanded(p) is nonempty, nondeterministically choose a set S from minimal(p) and update p by incrementing each  $p_j$  such that j belongs to S. It is easy to argue that this algorithm terminates. In the following parts, let p denote the final price vector produced by some execution of algorithm  $\mathcal{A}$ .
  - (a) Use the result of question 1 to argue that p is at most  $p^*$ .
  - (b) Prove that for any set of items S, we have  $|interested(p, S)| \ge |S|$ . Hint: Use induction on the number of iterations performed by  $\mathcal{A}$ , and bear in mind the existence of the "dummy" buyers.

- (c) Prove that there is an assignment x' such that every buyer i in yes(p) is assigned to an item in demand(p, i). Hint: It is known (Hall, 1935) that if G = (U, V, E)is a bipartite graph such that every subset U' of U has a neighborhood of size at least |U'| in V, then G admits a matching M such that every vertex in U is matched in M. (The "neighborhood" of a subset U' of U is the set of all vertices in V that are adjacent to at least one vertex in U'.)
- (d) Prove that there is an assignment x'' such that every item j is assigned to some buyer i such that j belongs to demand(p, i). Hint: Make use of the result of part (b) and the hint of part (c).
- (e) Prove that there is an assignment x such that every buyer i in yes(p) is assigned to an item in demand(p, i), and every item j is assigned to some buyer i such that j belongs to demand(p, i). Hint: It is known (Mendelson and Dulmage, 1958) that if bipartite graph G = (U, V, E) admits a matching M' such that every vertex in a subset U' of U is matched in M', and a second matching M'' such that every vertex in a subset V' of V is matched in M'', then G admits a matching M such that every vertex in  $U' \cup V'$  is matched in M.
- (f) Let x be an assignment satisfying the conditions of the previous part. Prove that there is a stable outcome u, v, x such that v = p.
- (g) Prove that  $p = p^*$ .