## Computer Science 597A

### Fall 2014

Homework 2 Due at 3pm on Tue, Nov 25, 2014

In this assignment we will explore a number of problems related to auctions, and Myerson's result.

#### Problem 1

Below is a theorem due to Bulow and Klemperer.

**Theorem 1** (Bulow-Klemperer) Let OPT(F, n) denote the revenue of Myerson's auction with n i.i.d. bidders sampled from F and VCG(F, n) denote the revenue of the second price auction (with no reserve) with n i.i.d. bidders sampled from F. Then if F is regular,  $VCG(F, n+1) \geq OPT(F, n)$ .

- Prove the theorem.
- Provide an example showing that it's necessary to assume F is regular.

Note: See e.g. Chapter 3.3 in Hartline's book (http://users.eecs.northwestern.edu/ hartline/amd.pdf) for a refresher on the optimal auction.

Hint: Define  $OPT^*(F, n)$  to be the optimal revenue obtained by an auction that always allocates the item. Prove that  $OPT^*(F, n + 1) \ge OPT(F, n)$  and that  $OPT^*(F, n) = VCG(F, n)$  for all n. Think why the second claim fails when F is irregular (this is very subtle! pay special attention to the details in Lemma 3.24 about ironed virtual values). Note that while the latter point is good to understand, it is possible to come up with an example directly, e.g. when n = 1.

# Problem 2

Below is a theorem due to Hartline and Roughgarden about auctions with independent but not identical bidders. Let  $F_i$  be the distribution for  $v_i$ , and  $r_i$  denote the optimal reserve for  $F_i$  (i.e.  $r_i = \bar{\phi}_i^{-1}(0)$ ). Consider the following mechanism: each bidder reports a bid. Let  $b_1$  be the highest bid and  $b_2$  the second highest. If  $b_1 > r_1$ , then bidder 1 gets the item and pays  $\max\{b_2, r_1\}$ . Otherwise, no one gets the item. Denote the revenue of this mechanism by  $VCG_r(\vec{F})$ .

**Theorem 2** (Hartline-Roughgarden 2009) Let  $OPT(\vec{F})$  denote the revenue of Myerson's auction with n independent bidders with  $v_i$  drawn from  $F_i$ . If each  $F_i$  is regular, then  $VCG_r(\vec{F}) \geq OPT(\vec{F})/2$ .

• Prove the theorem.

Hint: Break  $OPT(\vec{F})$  into  $OPT_1(\vec{F}) + OPT_2(\vec{F})$ .  $OPT_1$  denotes the expected virtual value of the winner if he is the highest bidder, and  $OPT_2$  denotes the expected virtual value of the winner otherwise. Show that  $VCG_r(\vec{F}) \geq OPT_1(\vec{F})$ , and that  $VCG_r(\vec{F}) \geq VCG(\vec{F}) \geq OPT_2(\vec{F})$ .

### Problem 3

The following are lemmas about setting reserves for a single bidder due to Daskalakis and Pierrakos, and Dhangwatnotai, Roughgarden, and Yan.

**Lemma 1** (Daskalakis-Pierrakos) Let  $Rev_r(F)$  denote the revenue obtained by selling to a single bidder with value sampled from F using price r, and OPT(F) denote the revenue when using the optimal reserve. If F is regular and r is the median of F, show that  $Rev_r(F) \geq OPT(F)/2$ .

**Lemma 2** (Dhangwatnotai-Roughgarden-Yan) If F is regular and r is a sample from F, show that  $\mathbb{E}_{r \leftarrow F}[Rev_r(F)] \geq OPT(F)/2$ .

- Prove Lemma 1.
- Prove Lemma 2.
- Provide an example showing that it's necessary to assume that F is regular (in both lemmas).

Hint: Use revenue curves.

### Problem 4

Below is a Theorem due to Birkhoff and Von Neumann. An  $n \times n$  matrix M is doubly-stochastic if  $M_{ij} \geq 0$  for all  $i, j, \sum_j M_{ij} = 1$  for all i, and  $\sum_i M_{ij} = 1$  for all j. M is a permutation matrix if in addition each  $M_{ij} \in \{0, 1\}$ .

**Theorem 3** (Birkhoff-von Neumann) Every doubly-stochastic matrix can be written as a convex combination of permutation matrices. That is, for all doubly stochastic M, there exists a finite k and permutation matrices  $M_1, \ldots, M_k$  and non-negative multiplies  $c_1, \ldots, c_k$  such that  $\sum_i c_i = 1$  and  $\sum_i c_i M_i = M$ .

• Prove the theorem. (*Hint:* There are several inductive proofs, where the basic premise is that a doubly-stochastic matrix with T non-zero entries where T > n, can be represented as a convex combination of matrices with fewer than T non-zero entries.)