## CSCI-4110/6110: Computational Social Processes, 2016 Fall Homework 2

You can either upload your solution to LMS or hand in an hard copy (please do not do both). If you have questions about the statements please post on Piazza.

**Problem 1. ILP for Kemeny (2pts)** Prove that it suffices to check conditions for all cycles of length 3 in the ILP of Kemeny. I.e. if  $x_{ab}$ 's do not correspond to a linear order then one of the constraints must be violated.

**Problem 2. Manipulation (8pts)** Suppose agent 1 is a manipulator, whose preferences are  $a \succ b \succ c \succ d$ . Let  $P_{-1}$  denote the votes of other agents.

$$P_{-1} = 1@[b \succ c \succ d \succ a] + 2@[c \succ d \succ a \succ b] + 1@[d \succ a \succ b \succ c]$$

For each of the following rule, either show a beneficial manipulation of agent 1, or say that agent 1 has no incentive to manipulate (no proof is needed for the latter). Notice that a **beneficial manipulation means that agent** 1 **must prefers the new winner to the old one w.r.t. to her true preferences**  $a \succ b \succ c \succ d$ . Ties are broken alphabetically in favor of alternatives with higher priority (for example, when eliminating tied alternatives, those with lower priority will be eliminated).

- 1. Plurality.
- 2. Borda.
- 3. Veto.

- 4. Plurality with runoff.
- 5. STV.
- 6. Bucklin.
- 7. Copeland.
- 8. Ranked Pairs.

## Problem 3. Single-Peaked Preferences (3pts)

- 1. Is  $b \succ c \succ a \succ d$  compatible with the social axis  $a \rhd b \rhd c \rhd d$ ? (The best way to verify this is to draw the plot as we did in the class).
- 2. Is  $a \succ c \succ d \succ b$  compatible with the social axis  $a \rhd b \rhd c \rhd d$ ?
- 3. Prove that if a linear order V is compatible with a social axis S if and only if it is compatible with the reserves ranking rev(S). For example, if  $S = a \triangleright b \triangleright c$  then  $rev(S) = c \triangleright b \triangleright a$ . Your proof should work for all S, not just this example. Notice that it must be a formal proof by verifying the definition of single-peakedness. Drawing the plot is usually not a valid formal proof.

**Problem 4. Mallows' model (3pts)** Prove that the MLE of Mallows' model outputs a ranking with minimum KentallTau distance to the profile. This holds for arbitrary  $0 < \varphi < 1$ .

**Problem 5. Mallows' model (4pts)** Let the data be generated from Mallows' model. Let

$$P = 1@[b \succ a \succ c] + 1@[c \succ a \succ b] + 1@[a \succ b \succ c]$$

- 1. Calculate the probability distribution for all linear orders given ground truth parameter  $a \succ b \succ c$ . Each probability should be a function of  $\varphi$  and the normalization factor.
- 2. Calculate the likelihood of all parameters when the data is *P*. What is the outcome of MLE?

- 3. Suppose the prior is  $\pi(b \succ a \succ c) = \pi(b \succ c \succ a) = q$ , and the other linear orders have the same prior probability. Write down the posterior distribution (as a function of  $\varphi$ , q, and any normalization factor you want to introduce).
- 4. Continuing: Suppose  $\varphi = 0.6$ . What is the smallest q such that the MAP chooses a linear order where b is ranked at the top?

**Problem 6. Plackett-Luce model (4pts)** Let the parameter space be  $\Theta = \{(1, 4, 5), (4, 3, 3), (2, 7, 1)\}$ , where (1, 4, 5) means that the  $\lambda$  values for a, b, c are 1, 4, 5, respectively. Let P denote the same profile as in the previous question, i.e.

$$P = 1@[b \succ a \succ c] + 1@[c \succ a \succ b] + 1@[a \succ b \succ c]$$

- 1. Calculate the probability distribution over all linear orders given ground truth parameter (4, 3, 3).
- 2. Calculate the likelihood of all three parameters in  $\Theta$  when the data is P. What is the outcome of MLE?
- 3. Suppose the prior is  $\pi(1, 4, 5) = q$ , and the other two parameters have the same prior probability (1 - q)/2. Write down the posterior distribution over  $\Theta$  as a function of q and any normalization factor.
- 4. Continuing: what is the smallest q such that the MAP chooses (1, 4, 5)?

**Problem 7. ILP bonus question (5pts)** Given  $m \in \mathbb{N}$  and m positional scoring rules with scoring vectors  $(\vec{s^1}, \vec{s^2}, \dots, \vec{s^m})$ , where  $\vec{s^i} = (s_1^i, \dots, s_m^i)$ .

Design a mixed integer programming to find a profile P with the smallest number of votes so that all these m positional scoring rules output different winners. Your ILP should use only polynomially many (in m and n) variables and constraints.

**Remarks:** The ILP should be able to identify "failures", that is, situations where such a profile does not exist. You don't need to write down all constraints explicitly, but make sure that every parameter you use in the ILP is well defined.

**Hint:** Check out "Doubly stochastic matrix" and "Birkhoffvon Neumann theorem" at http://en.wikipedia.org/wiki/Doubly\_stochastic\_matrix