

## Hw7: Converting multiclass to binary classification task

Due: 11:45pm on Feb 25, 2010

The example files are under `dropbox/09-10/572/hw7/examples/`.

**Q1 (35 points):** Build a tool **q1.sh** that calls MaxEnt trainer/decoder in Mallet to handle *multiple* classes using **one-vs-all**, pretending that the trainer/decoder could handle only two classes.

- The command line is: `q1.sh training_data test_data output_dir > acc_file`
- `training_data` and `test_data` are in standard Mallet format: “instanceName goldClass f1 v1 f2 v2 ...” (e.g., **train.txt** and **test.txt**).
- `acc_file` is the accuracy file, and it has the same format as in Hw2-Hw5.
- `output_dir` is the output directory, which includes the following:
  - `class_map` (e.g., **ex1/class\_map**): the file has the format “class-name class-index”: class-name is the class name in the `training_data`, and class index is a number that starts from 1. For instance, the first class name in the `training_data` will have index 1, the second will have index 2, and so on. This file is used to determine what class name the class index “m” in m-vs-all (see below) refers to.
  - For each classifier (say m-vs-all, m is a class index), there should be a subdirectory called m-vs-all. For instance, if the `training_data` has three classes, there should be three subdirectories: 1-vs-all, 2-vs-all, and 3-vs-all. Each subdirectory should include the following files:
    - \* A training data file called “**train**”, which has the same format as `training_data`, and the goldClass in “train” is 1 or -1. This is the training file for the classifier m-vs-all.
    - \* Similarly, a test file called “**test**”.
    - \* A file called “**sys\_output**” that contains the classification results when running the classifier m-vs-all on `test_data`. The format is the same as `sys_output` files in Hw2-Hw5; that is, the format is “instanceName goldClass c1 p1 c2 p2”, where goldClass and  $c_i$  are “1” or “-1”, and  $p_i$  is the probability  $P(c_i | x)$  based on the classifier.
  - Under `output_dir`, there should be a file called “**final\_sys\_output**” (e.g., **ex1/final\_sys\_output**). This file has the format “InstanceName goldClassName [cn1 p1 cn2 p2 ...]”, where  $cn_i$  is a class name, and  $p_i$  is the probability  $P(class = 1 | x)$  when running the classifier for i-vs-all. The brackets “[...]” indicate that the  $(cn_i, p_i)$  pairs in each line are sorted according to  $p_i$  in descending order. Note that since  $p_i$  comes from different classifiers,  $\sum_i p_i$  is not necessarily equal to one.

**Q2 (35 points):** Build a tool **q2.sh** that calls MaxEnt trainer/decoder in Mallet to handle *multiple* classes using **all-pair**, pretending the trainer/decoder could handle only two classes.

- The command line is: `q2.sh training_data test_data output_dir > acc_file`

- The format of the files are the same as in Q1 except the following:
  - The subdirectory **m-vs-all** in Q1 becomes **m-vs-n** in Q2, where m and n are class indices (e.g., 1-vs-2, 1-vs-3).
  - The file “**final\_sys\_output**” has the format “InstanceName goldClassName sysClassName 1:2  $p_{1,2}$  1:3  $p_{1,3}$  ... i:j  $p_{i,j}$  ... [c1=n1 c2=n2 ...]”, where  $p_{i,j}$  is the probability that x belongs to class 1 (instead of -1) according to the classifier for the class pair (i,j).  $n_i$  is the number of times class  $c_i$  wins, and “[...]” indicates that the list of  $c_i=n_i$  is sorted by the value of  $n_i$  in descending order. An example file is in **ex2/final\_sys\_output**.
  - When there is a tie w.r.t. the number of games a class wins, choose the class with the smallest class index.

**Q3 (25 points)** Use **train.txt** and **test.txt** as the training and test data. Run Mallet and commands in Q1 and Q2 to fill out Table 1.

- Row 1 is the training and test accuracy when using Mallet commands to handle the data directly; that is, do not pretend that Mallet could handle only two classes.
- Row 2 is the accuracy when running q1.sh
- Row 3 is the accuracy when running q2.sh

Table 1: Training and test accuracy

	training acc	test acc
Run Mallet directly		
Run q1.sh (one-vs-all)		
Run q2.sh (all-pairs)		

**Q4 (5 points)** What conclusions can you draw from Table 1?

**Submission:** Submit a tar file via CollectIt. The tar file should include the following.

- If your team has two people, please submit only one copy. In your note file, please list the names of team members.
- In your note file hw7.\*, include your answers to Q3 and Q4, and any notes that you want the TA to read.
- The source code for Q1 and Q2.
- The output\_dir created for Q3: q1\_res/ is the output\_dir when running q1.sh and q2\_res/ is the one when running q2.sh.
- The acc\_file should be put under q\*\_res/: e.g., q1\_res/acc\_file is the acc\_file when running q1.sh.