IE613: Online Machine Learning

Jan-Apr 2016

Assignment 2: March 17

Instructions: You are free to code in Python/Matlab/C/R. Discussion among the class participants is highly encouraged. But please make sure that you understand the algorithms and write your own code. Submit the code by 24th March.

Question 1 (Full information setting) Consider the problem of prediction with expert advice with d=10. Assume that the losses assigned to each expert are generated according to independent Bernoulii distributions. The adversary/environment generates loss for experts 1 to 8 according to Ber(.5) in each round. For the 9th expert, loss is generated according to Ber(.5 - Δ) in each round. The losses for the 10th expert are generated according to different Bernoulii random variable in each round- for the first T/2 rounds, they are generated according to Ber(0.5+ Δ) and the remaining T/2 rounds they are generated according to Bernoulii random variable Ber(0.5 - 2Δ). Generate (pseudo) regret vs T plots for each of the following algorithms for $\Delta = 0.1$ and $T = 10^6$. The averages should be taken over atleast 50 sample paths (more is better). Display the 95% confidence intervals for each plot. Select the best value for the learning rate η .

- Weighted Majoirty algorithm.
- Follow the Regularized Leader (FTRL) with linear loss functions and negative entropy as the regularizer.
 In round t = 1, 2, · · · , T, the linear function is f_t(w) = w'v_t, where v_t ∈ {0, 1}^d is loss vector generated in round t. Set the weight parameter η appropriately to get best performance.

Question 2 (Bandit setting) Consider the problem of multi-armed bandit with K = 10 arms. Assume that the losses are generated as in Question 1. For each of the following algorithms generate (pseudo) regret vs T plots. The averages should be taken over at least 50 sample paths (more is better). Display the 95% confidence interval for each plot. Select the best values for parameters, η, γ and β .

- *EXP3*,
- EXP3.P
- EXP-IX

Question 3 Comment on the performance of EXP, EXP3.P and EXP-IX. Which one performs better? Can you think of a your own method which performs better than any of the above methods. Give pseudo-code of your algorithm and compare its performance with others.