

## Exercise 2: Probabilities

*You can earn up to 10 points on this exercise.*

*You may work as a group of up to 3 people, but please submit your own version.*

*You may use any programming language you wish, but any submission that we cannot run on our computers without installing things must be presented to the class.*

*Please email your solution to `mittul.singh@lsv.uni-saarland.de` or submit before the tutorial by **10 am, November 11, 2015**.*

The following tasks have been blatantly copied and inspired from Statistical Machine Translation book available here: <http://www.statmt.org/book/>

### TASK 1

If we flip a coin 10 times, we might get the outcome *HTTHTHTHTT* (*H for heads, T for tails*).

- a. Estimate a distribution by maximum likelihood estimation for this event. Estimating a distribution in this case would mean reporting probability of two disjoint events; first  $p(\text{observing a heads})$  and second  $p(\text{observing a tails})$ . (3 points)
- b. We want to test the quality of the estimation. We flip the coin five times and get *HHTTH*. What is the probability of this outcome according to
  - i. the estimated distribution, and (1 point)
  - ii. the uniform distribution or said another way assume that the coin is unbiased ? (1 point)
- c. What is the entropy of a coin toss where the coin has a head on each side (fake coin) ? (2 points)

### TASK 2

Computations with probability distributions:

- a. Prove that  $p(y|x) = p(y)$  if  $X$  and  $Y$  are independent. Do explain each of your steps. (3 points)  
OR
- b. Derive the Bayes rule. Do explain each of your steps. (3 points)

### BONUS

Given that the entropy of a random variable  $X$  is measured as:

$$H(X) = - \sum_{x \in X} p(x) \log_2 p(x)$$

where  $0 \log_2 0 = 0$ . Plot the entropy of an unfair coin showing heads ( $X = H$ ) against probability of showing heads ( $0 < p(X = H) < 1$ ) (3 points)