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**Please note:** in AML, **Exercises** are embedded in the text of each section; **Problems** are at the end of each chapter. Please be sure you work the assigned problem or exercise to get credit.

1. AML Problem 1.7(a) (p. 36), plus the following part:

(b) Take the scenario of part (a), for the case of 1,000 coins, and  $\mu = 0.05$ . Consider the following interpretation in applying it in a machine learning setting.

There is one hypothesis that is given (one decision boundary and corresponding set of decision regions, or one decision rule); call it h. The out of sample error is  $E_{out}(h) = 0.05$ , and the in-sample error depends on the dataset drawn.

**Hint:** The number of tosses of a coin, N = 10, corresponds to the size of a dataset.

Complete the machine-learning interpretation by answering the following:

- (i) What do the 1000 coins represent?
- (ii) What does the calculation in part (a), for 1000 coins and  $\mu = 0.05$ , represent?
- (iii) In this interpretation, take the most general version of the Hoeffding inequality in Ch. 1:

$$P[|v - \mu| > \epsilon] \le 2Me^{-2\epsilon^2 N}$$

Give values (or expressions) for  $\mu$ , $\nu$ ,and M.

- 2. AML Problem 2.1 (p. 69).
- 3. AML Problem 2.2 (p. 69) Assume feature space is 2D. A "positive rectangle" is a rectangle-shaped decision boundary, and has value (label) +1 inside and value (label) -1 outside. The sides of the rectangle are parallel to the coordinate axes.

**Hint** for the last question: the bound is a polynomial in N.

- 4. [Based on AML Exercise 2.1, p. 45.]:
  - (a) Find the smallest break point k for the hypothesis set consisting of Positive Rays (defined in Example 2.2).
  - (b) Find the smallest break point k for the hypothesis set consisting of Positive Intervals (defined in Example 2.2).

HW4 continues on next page...

## Reading

AML Ch. 2. Specifically, review pp. 39-49 (most of this was covered in Lecture 8), and read pp. 50-68. The "safe skip" part is optional reading, and the "Sketch of the proof" after Theorem 2.5 is also optional reading.

## Problems on the reading

- 5. AML Exercise 2.6 (p. 60).
- 6. AML Exercise 2.8 (p. 63). Note that g in AML notation is  $h_g$  in our class notation (= best chosen hypothesis in  $\mathcal{H}$ ).