

COMP8601: Probabilistic Method & Randomized Algorithms

(Short name: Randomized Algorithms)

Introduction

Instructor: Hubert Chan

3 Sep 2013

Teaching Team

Instructor: Hubert Chan

Office: CYC 429

Email: hubert at cs.hku.hk

I check my email frequently!

Teaching Assistants

– Fei Chen (CYC LG101, fchen at cs.hku.hk)

Please use **COMP8601** in subject.

Why should one take this class?

- Interested in advanced algorithm design
- Learn probability tools to analyze uncertain situations
- Train analytical thinking
- Seek challenge in problem solving
- Preparation for further study

Outcomes

[O1 Abstract Concepts] Understand abstract **mathematical concepts** which are involved in designing advanced algorithms, e.g., probability theory, conditional expectation, Markov's inequality, measure concentration.

[O2 Problem Solving] Be able to apply abstract concepts in **designing sophisticated algorithms** to tackle various problems, e.g., MAX-CUT, MAX-3-SAT, Set Cover, PAC-learning.

[O3 Performance Analysis] Be able to apply formal reasoning to **analyze the performance** of algorithms, e.g., in terms of running time, space, failure probability, number of random bits, number of samples.

[O4 Independent and Lifelong Learning] Be inspired to **learn independently** and motivated to solve challenging problems.

Class Overview

Content:

- Advanced Algorithm Techniques
- Emphasis on **Probability Techniques**
- Analysis of Randomized Algorithms

Style:

- Theoretical Computer Science
- Theorems and Proofs
- Rigorous, but not pedantic
(we assume real numbers exist!)

Teaching Style

Teaching medium: PC Tablet & white/black board

You are **strongly encouraged** to take notes!

If there is **anything** you do not understand in class,
please ask!

Meeting Times

Lectures

- Tue 10:30AM – 12:00PM MB121
 - Thu 10:30AM – 12:00PM MB141
 - **Consultation Hours (1 to 1, optional)**
 - Fei Chen Tue 03:00PM – 04:00PM CYC LG101
 - Hubert Thu 12:00PM – 01:00PM CYC 429
- (Please send email for other times.)

Timetable

Mon	Tue	Wed	Thu	Fri
	10:30AM- noon [Lectures] 3-4[Fei]		10:30AM- noon [Lectures] noon[Hubert]	

◆ Outside consultation hours: by appointments

Homepage

Students are suggested to visit the course homepage **regularly**

Homepage (Moodle):

<http://www.cs.hku.hk/~c8601>

Please send email if you need a **prompt reply**.

Reference

No compulsory textbooks. Suggested extra reading:

- *Randomized Algorithms*, Motwani and Raghavan
- *The Probabilistic Method*, Alon and Spencer

Other Reference

- Class homepage in previous years 2009, 2010
- Similar classes taught in other universities

CMU <http://www-2.cs.cmu.edu/afs/cs/academic/class/15859-f04/www>

Washington <http://www.cs.washington.edu/homes/jrl/cs525/>

- Google
- Wikipedia

Assessment

3-hour examination + in-course assessment

Examination: 50%

In-course assessment: 50%

- 4 homeworks: 25%
- 1 mid-term: 25%

Assessment Criteria

- **Understanding** is the **key point**
- Notation and equations are the **means** to understanding the concepts, not the **ends**.

What is understanding of a concept?

1. Ability to express in one's own words.
2. Use the concept in applicable situations.

Important Dates

Tentative homework deadlines:

- 12 Sep for Homework 1
- 10 Oct for Homework 2
- 14 Nov for Homework 3
- 28 Nov for Homework 4

Tentative mid-term date:

- 22 Oct (right after reading week)

Homeworks

Assignment Box: **A7, CYC Building 3/F**

Late Policy:

1 day late: 50% penalty

2 days late: no marks will be given

- Assignments should be submitted **before 7 pm** on the due date.

Plagiarism

Plagiarism is the action of using or copying someone else's idea or work and pretending that you thought of it or created it.

First Attempt:

Students who admit committing plagiarism for the first time shall be warned in writing and receive a **zero mark for the component concerned**. For those who do not confess, the case would be referred to the Programme Director for consideration.

Subsequent Attempt:

If students commit plagiarism more than once during the course of studies, the case shall be referred to the Programme Director for consideration. The Programme Director will investigate the case and consider referring it to the University Disciplinary Committee, which may impose any of the following penalties: **a published reprimand, suspension of study for a period of time, fine, or expulsion from the University**.

But discussing with classmates is encouraged!

Quick Survey

1. Probability
2. Random variables
3. Expectation
4. Conditional probability
5. Independence
6. Probability density function
7. Moment generating function $\phi(t) = E[e^{tX}]$
8. Chebyshev's Inequality
9. Chernoff Bound, Azuma's Inequality

First Milestone: Measure Concentration

Suppose you flip a fair coin 1000 thousands times.
How many heads do you expect to see?

The expectation of the number of heads = 500.
You would not expect to see exactly 500 heads.

However, you would be quite certain that the number of heads fall between 400 and 600.

We say that the number of heads is *concentrated around its mean*.

What is probability?

1. Sample space Ω : possible outcomes.
Flipping a coin: $\Omega = \{ H, T \}$
2. Collection \mathcal{F} of events. An event is a subset of Ω .
 - (i) $\emptyset \in \mathcal{F}$
 - (ii) if $A \in \mathcal{F}$, then $(\Omega \setminus A) \in \mathcal{F}$
 - (iii) if $A_i \in \mathcal{F}$ for each positive integer i , then $\cup_i A_i \in \mathcal{F}$

$$\mathcal{F} = \{ \emptyset, \{H\}, \{T\}, \{H,T\} \}.$$

\emptyset is an impossible event, e.g., getting a “6”

3. Probability function $\Pr : \mathcal{F} \rightarrow [0,1]$

- (i) $\Pr(\Omega) = 1$

- (ii) For countable number of pairwise disjoint events A_i ,
 $\Pr(\cup_i A_i) = \sum_i \Pr(A_i)$.

Some Properties

0. If A is an event, \bar{A} is the complement event $\Omega \setminus A$.
$$\Pr(\Omega \setminus A) = 1 - \Pr(A).$$
1. If A and B are events,
$$\Pr(A \cup B) = \Pr(A) + \Pr(B) - \Pr(A \cap B)$$
2. **Union Bound.** If A_0, A_1, \dots, A_{n-1} are events,
$$\Pr(\cup_i A_i) \leq \sum_i \Pr(A_i).$$

Notation: when there is no chance of confusion,

\cup_i means $\cup_{i \in [n]}$

\sum_i means $\sum_{i \in [n]}$

Independent Events

Two events A and B are **independent** if
 $\Pr(A \cap B) = \Pr(A) \Pr(B)$

Do not confuse with:

Two events A and B are **mutually exclusive** if they are disjoint, i.e., $A \cap B = \emptyset$

Conditional Probability

Suppose A and B are events such that $\Pr(B) > 0$.
Then, $\Pr(A | B) = \Pr(A \cap B) / \Pr(B)$.

Example.

Rolling a die.

A is the event of obtaining a number larger than 3

B is the event of getting an even number

$$\Pr(A | B) = (2/6) / (1/2) = 2/3.$$

Random Variable

A random variable X is used to investigate quantities that we are interested in.

It assigns every point ω in the sample space a number $X(\omega)$.

Formally, it is a function $X : \Omega \rightarrow \mathbb{R}$.

Example. Rolling two dice. Interested in the sum.

$$\Omega = \{(i,j) : 1 \leq i, j \leq 6\}$$

$$X(i, j) = i + j$$

$$\Pr(X = 0) = \Pr(\{\omega : X(\omega) = 0\})$$

Different Kinds of Random Variables

- Discrete Random Variables
 - $\{0, 1\}$ -random variable
 - Integer-valued variables
- Continuous Random Variables

Function of Random Variable

If $f : \mathbb{R} \rightarrow \mathbb{R}$ is a function and X is a random variable, then $f(X)$ is also a random variable.

In particular, $f(X)(\omega) = f(X(\omega))$

Expectation

The expectation or mean of a random variable is

$$\text{Discrete: } E[X] = \sum_{\omega} X(\omega) \Pr(\omega)$$

$$\text{Continuous: } E[X] = \int_{\omega} X(\omega) d \Pr(\omega)$$

Most of the time, we focus on discrete case.

Useful equality, grouping terms (which points ω is mapped to k by X):

$$\begin{aligned} E[X] &= \sum_{\omega} X(\omega) \Pr(\omega) = \sum_k \sum_{\omega: X(\omega) = k} X(\omega) \Pr(\omega) \\ &= \sum_k \sum_{\omega: X(\omega) = k} k \Pr(\omega) = \sum_k k \Pr(X = k) \end{aligned}$$

Linearity of Expectation

If X_0, X_1, \dots, X_{n-1} are random variables (not necessarily independent), and a_0, a_1, \dots, a_{n-1} are numbers, then

$$E \left[\sum_i a_i X_i \right] = \sum_i a_i E[X_i]$$

Independent Random Variables

The random variables X_0, X_1, \dots, X_{n-1} are independent if for all ranges of values I_1, I_2, \dots, I_{n-1} ,

$$\Pr(\bigwedge_i X_i \in I_i) = \prod_i \Pr(X_i \in I_i)$$

Notation: \wedge means “and”, “intersection”

Important Fact (homework):

If X and Y are independent random variables, then $E[XY] = E[X] E[Y]$.

Observe this is **wrong**: $E[X^2] = (E[X])^2$