

# Random Variables

W. M. Song 桑慧敏  
Tsing Hua Univ. 清華大學

2015.09.23

- 1 Song 歌詞
- 2 樣本點, 實數值, 隨機變數結連理
- 3 cdf, pdf, 身份證件辨唯一
- 4 期望值, 變異數, 又名一二階動差
- 5 馬可夫, 柴比雪夫, 神龍現尾真稀奇

# Practice Problems

1. List two well-known random variables (有名字的隨機變數):  
\_\_\_\_\_ and \_\_\_\_\_.
2. If we know \_\_\_\_\_, we can compute the probability of any event relating to the random variable  $X$ .
3. 解釋歌詞意思

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# Random Variable (Song)

## 隨機變數基本概念 (三輪車調)

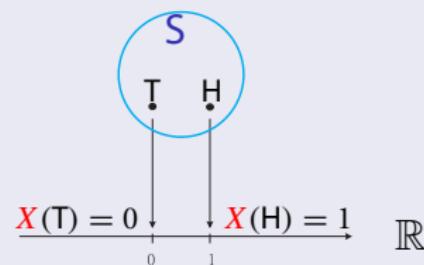
- 樣本點, 實數值, **隨機變數**結連理
- cdf, pdf, 身份證件辨**唯一**
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- sample point, real number, **random variable** connects them
- cdf, pdf, **ID** the role they play
- $E(X)$ ,  $V(X)$ , 1st and 2nd Moments
- Markov, Chebyshev, P of tail events so easy.
  
- 作業是熟讀本章的內容, 然後修改歌詞。以能闡釋該章核心精神為評分標準。

# 樣本點, 實數值, 隨機變數結連理

## Ex. Flip a fair coin

- Outcomes "H" or "T"
- Compute  $P("H")$
- Sample space:  $S = \{ H, T \}$

$$X: s \rightarrow r, s \in S, r \in \mathbb{R}$$



- Q: List one Advantage of Using the R.V.  $X$
- A: Quantitative (量化)

# Express “Events” via R.V.

| Type | Event, E<br>(完整)             | Event<br>(縮寫)         | P(E)<br>(完整)             | P(E)<br>(縮寫)         |
|------|------------------------------|-----------------------|--------------------------|----------------------|
| 1    | $\{s : X(s) \leq x\}$        | $\{X \leq x\}$        | $P(\{X \leq x\})$        | $P(X \leq x)$        |
| 2    | $\{s : X(s) < x\}$           | $\{X < x\}$           | $P(\{X < x\})$           | $P(X < x)$           |
| 3    | $\{s : X(s) \geq x\}$        | $\{X \geq x\}$        | $P(\{X \geq x\})$        | $P(X \geq x)$        |
| 4    | $\{s : X(s) = x\}$           | $\{X = x\}$           | $P(\{X = x\})$           | $P(X = x)$           |
| 5    | $\{s : X(s) > x\}$           | $\{X > x\}$           | $P(\{X > x\})$           | $P(X > x)$           |
| 6    | $\{s : a \leq X(s) \leq b\}$ | $\{a \leq X \leq b\}$ | $P(\{a \leq X \leq b\})$ | $P(a \leq X \leq b)$ |
| 7    | $\{s : a \leq X(s) < b\}$    | $\{a \leq X < b\}$    | $P(\{a \leq X < b\})$    | $P(a \leq X < b)$    |
| 8    | $\{s : a < X(s) \leq b\}$    | $\{a < X \leq b\}$    | $P(\{a < X \leq b\})$    | $P(a < X \leq b)$    |
| 9    | $\{s : a < X(s) < b\}$       | $\{a < X < b\}$       | $P(\{a < X < b\})$       | $P(a < X < b)$       |

- Q: List more advantages of Using a Random Variable
- A: (1) Quantitative (量化)
- A: (2) Simplify the expression for events (ex. Flip a fair coin twice, event that one “H” appears: {(T,H), (H,T)}. Can we simply this expression?
- A: (3) All events can be expressed as one of the above 9 types or their combinations

# 隨機變數 $X$ , 證件, 屬性

## Identification (ID, 證件)

- cdf:  $F_X(x) = \Pr(X \leq x)$
- pmf or pdf:  

$$f_X(x) = \begin{cases} F_X(x) - F_X(x^-) = \Pr(X = x), & \text{若 } X \text{ 為離散型隨機變數} \\ \frac{dF_X(x)}{dx}, & \text{若 } X \text{ 為連續型隨機變數} \end{cases}$$
- mgf:  $M_X(t) = \mathbb{E}(e^{tx})$

## Characteristics (屬性)

- Moments (動差): Expected value, variance, skewness, and kurtosis,...
- quartiles (四分位數)
- Percentiles (百分位數)
- Tail events probability (尾端機率) : Markov and Chebyshev's Inequalities
- 將有關隨機變數的課題分成兩類: 證件與屬性, 你的看法呢?

# ID 1: $F_X(x)$ , cdf of $X$

## Definiton of $F_X(x)$

$$F_X(x) = \Pr(X \leq x)$$

| type | $\Pr(E)$  | Via $F_X(x)$          |
|------|---|-----------------------|
| 1    | $\Pr(X \leq x)$                                     | $F_X(x)$              |
| 2    | $\Pr(X < x)$  | $F_X(x^-)$            |
| 3    | $\Pr(X \geq x) = 1 - \Pr(X < x)$                    | $1 - F_X(x^-)$        |
| 4    | $\Pr(X > x) = 1 - \Pr(X \leq x)$                    | $1 - F_X(x)$          |
| 5    | $\Pr(X = x) = \Pr(X \leq x) - \Pr(X < x)$           | $F_X(x) - F_X(x^-)$   |
| 6    | $\Pr(a \leq X \leq b) = \Pr(X \leq b) - \Pr(X < a)$ | $F_X(b) - F_X(a^-)$   |
| 7    | $\Pr(a < X \leq b) = \Pr(X \leq b) - \Pr(X \leq a)$ | $F_X(b) - F_X(a)$     |
| 8    | $\Pr(a \leq X < b) = \Pr(X < b) - \Pr(X < a)$       | $F_X(b^-) - F_X(a^-)$ |
| 9    | $\Pr(a < X < b) = \Pr(X < b) - \Pr(X \leq a)$       | $F_X(b^-) - F_X(a)$   |

- Q: Why can  $F_X(x)$  play the role of "ID"?
- A: With  $F_X(x)$ , we can compute the probability of any event relating to  $X$

# ID 2: $f_X(x)$ , pmf or pdf of $X$

## Definiton of $f_X(x)$

$$f_X(x) = \begin{cases} F_X(x) - F_X(x^-) = \mathbb{P}(X = x), & \text{若 } X \text{ 為離散型隨機變數} \\ \frac{dF_X(x)}{dx}, & \text{若 } X \text{ 為連續型隨機變數} \end{cases}$$

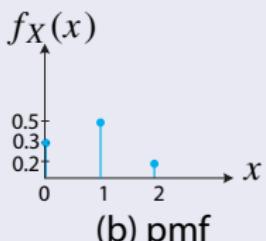
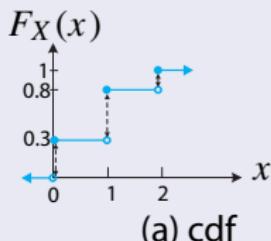
| type | $\mathbb{P}(E)$               | discrete                        | continuous                       |
|------|-------------------------------|---------------------------------|----------------------------------|
| 1    | $\mathbb{P}(X \leq x)$        | $\sum_{y \leq x} f_X(y)$        | $\int_{-\infty}^x f_X(y) dy$     |
| 2    | $\mathbb{P}(X < x)$           | $\sum_{y < x} f_X(y)$           | $\int_{-\infty}^x f_X(y) dy$     |
| 3    | $\mathbb{P}(X \geq x)$        | $1 - \sum_{y < x} f_X(y)$       | $1 - \int_{-\infty}^x f_X(y) dy$ |
| 4    | $\mathbb{P}(X > x)$           | $1 - \sum_{y \leq x} f_X(y)$    | $1 - \int_{-\infty}^x f_X(y) dy$ |
| 5    | $\mathbb{P}(X = x)$           | $f_X(x)$                        | 0 (why?)                         |
| 6    | $\mathbb{P}(a \leq X \leq b)$ | $\sum_{a \leq y \leq b} f_X(y)$ | $\int_a^b f_X(y) dy$             |
| 7    | $\mathbb{P}(a < X \leq b)$    | $\sum_{a < y \leq b} f_X(y)$    | $\int_a^b f_X(y) dy$             |
| 8    | $\mathbb{P}(a \leq X < b)$    | $\sum_{a \leq y < b} f_X(y)$    | $\int_a^b f_X(y) dy$             |
| 9    | $\mathbb{P}(a < X < b)$       | $\sum_{a < y < b} f_X(y)$       | $\int_a^b f_X(y) dy$             |

- A: With  $f_X(x)$ , we can compute the probability of any event

# $F_X(x)$ and $f_X(x)$

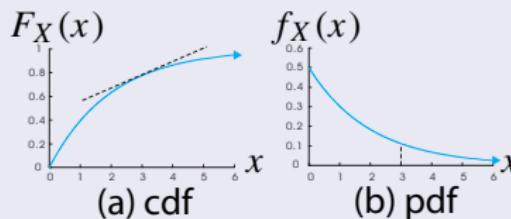
## discrete R.V.s

- $f_X(x) = F_X(x) - F_X(x^-) = \mathbb{P}(X = x)$
- $F_X(a) = \sum_{x \leq a} f_X(x)$



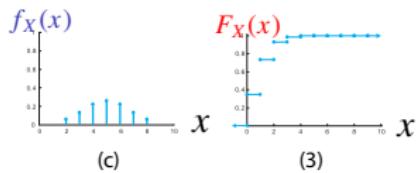
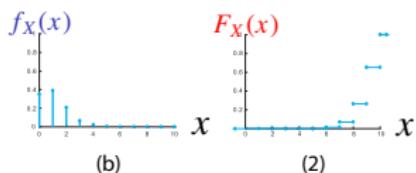
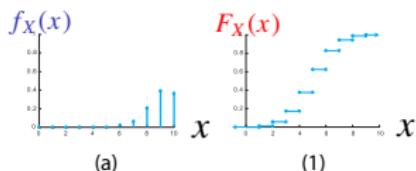
## continuous R.V.s

- $f_X(x) = \frac{dF_X(x)}{dx}$
- $F_X(a) = \int_{x \leq a} f_X(x) dx$



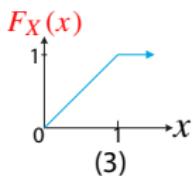
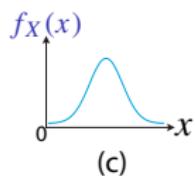
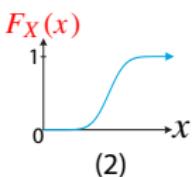
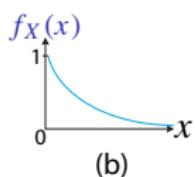
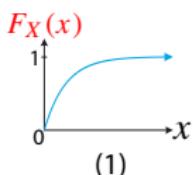
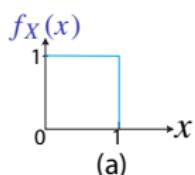
- Discussion. The use of plots

# Match $F_X(x)$ with $f_X(x)$



- Match: (a, 2), (b, 3), (c, 1)

# Match $F_X(x)$ with $f_X(x)$ (cont.)



- Match: (a, 3), (b, 1), (c, 2)

# 期望值, 變異數, 又名一二階動差

## Characteristics (屬性) of random variables

- Moments (動差):  $E(X^k)$  or  $E[(X - \mu_X)^k]$ ; Expected value, variance, skewness, and kurtosis,...
- quartiles (四分位數):  $q_i = P(X \leq q_i) \geq 0.25i, i = 1, 2, 3$
- Percentiles (百分位數)
- Tail events probability (尾端事件機率) : Markov and Chebyshev's Inequalities
- Process capacity measures (製程能力指標):  $C_p, C_{pk}, \dots$  (text 8.3)

# 馬可夫, 柴比雪夫, 神龍現尾真稀奇

- **Markov's Inequality:** Suppose that  $Y$  is a non-negative random variable and  $E(Y) < \infty$ . For any positive real number  $a > 0$ , we have

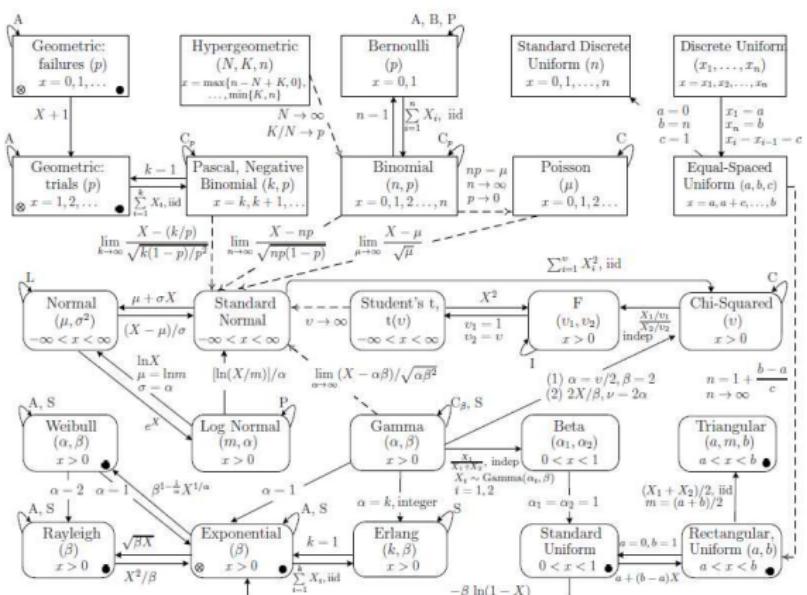
$$P(Y \geq a) \leq \frac{E(Y)}{a}$$

- **Chebyshev's Inequality:** Let  $X$  be any random variable with  $E(X) < \infty$ ,  $\sigma_X^2 < \infty$ . For any  $k > 0$ ,

$$P(|X - \mu_X| \geq k\sigma_X) \leq 1/k^2$$

- **With Markov's and Chebyshev's Inequality, but without cdf or pdf, we can get the probability upper bounds of some events.**

# Well-Known Random Variables



- Reference: Relationships among 25 Distributions (Song, W.-M. T. and Chen, Yi-chun (2011), Eighty Univariate Distributions and their Relationships Displayed in a Matrix Format, IEEE Transactions on Automatic Control, Vol. 56, No. 8, pp. 1979-1984).

# More questions

- 1. 桑老師試作的“隨機變數(三輪車調)”,大家試著唱唱看,並想一想此歌詞是否有幫助你更了解本章涵意?
- 2. 舉例說明“隨機變數”的功用?
- 3. 累積分配函數  $F_X(x)$  與分配函數  $f_X(x)$  之關係為何? 分別以公式與圖形說明之。
- 4. 符號  $F_X(x)$  與  $f_X(x)$  中下標示大寫,括號內是小寫,為何?
- 5. 累積分配函數與分配函數既然有一對一的關係,何時特別需要使用分配函數? 何時特別需要使用累積分配函數? 舉例說明之。
- 6. 列出一個有名字的隨機變數。(hint: 如果隨機變數  $X$  服從常態分配, 則稱隨機變數  $X$  為常態隨機變數)
- 7. If we know cdf  $F_X$ , or pdf  $f_X$ , we can compute the probability of any event relating to the random variable  $X$ .
- 參考書: 桑慧敏, 機率與統計原理第三章, McGrawHill 出版, 2007