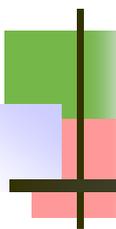


共通基礎科目



# 確率統計・特論 (Probability and Statistics)

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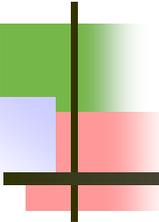
Today's topics

- what is probability?
- probability space

来嶋 秀治 (Shuji Kijima)

システム情報科学研究所 情報学部門

Dept. Informatics, ISEE



# Preview

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About this class

## Evaluation

supplemental option for credit  
not mandatory, but recommend.

- exercises (レポート課題) =: z (/10)
  - Almost every class (10回程度)
  - Submit hard copy at the end of class, or email to [kijima@inf.kyushu-u.ac.jp](mailto:kijima@inf.kyushu-u.ac.jp) before then.
- midterm (中間試験): (early) Nov., =:x (/50)
- final (期末試験): late Jan or early Feb, =:y (/50)
- score =  $x+y (+ z)$ , something like that...
- passing mark = 60. No makeup exam (追試は無い)

## Lecture

as much as possible... sorry.

- Use **slides** and/or **board**.
- **Language**: speak in Japanese, write in English.
- mathematical backgrounds (undergraduate level)  
e.g., calculus (微積分), linear algebra (線形代数), etc...
- Questions are welcome in English or Japanese. Do not hesitate!
- Check the web page!

<http://tclab.csce.kyushu-u.ac.jp/~kijima/>

you can find exercise, keywords, and schedule.

- **Office hour**: Fri(金曜日) 16:40–18:10 (W2, 7F, 741)
- Topics  $\Rightarrow$  see <http://tclab.csce.kyushu-u.ac.jp/~kijima/>

## References

- 藤澤洋徳, 確率と統計, 現代基礎数学 13, 朝倉書店, 2006, 4000円.
- M. Mitzenmacher, E. Upfel,  
Probability and Computing: Randomized Algorithms and Probabilistic Analysis,  
Cambridge University Press, 2005.  
(邦訳) 小柴健史, 河内亮周, 確率と計算 --乱択アルゴリズムと確率的解析--,  
共立出版, 2009.

### [確率論]

- 伏見正則, 確率と確率過程, 朝倉書店, 2002, 2800円

### [統計学]

- 日本統計学会, 統計学 (統計検定1級対応), 東京図書, 2013.
- 東大教養学部統計学教室編, 統計学入門, 東京大学出版会, 1991, 2940円.

Check the web page!

<http://www.tcslab.csce.kyushu-u.ac.jp/~kijima/>

## Requirement (前提知識)

### Analysis (解析学)

- Differentiation (微分)

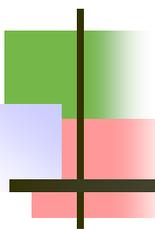
- $\frac{d}{dx} \log(x)$  ?

- Integration by parts (部分積分)

- $\int_a^b x \exp(-x) dx$

### Linear algebra (線形代数学)

- Bases (基底)
- Eigenvalues/diagonalization (固有空間/対角化)



# What is Probability?

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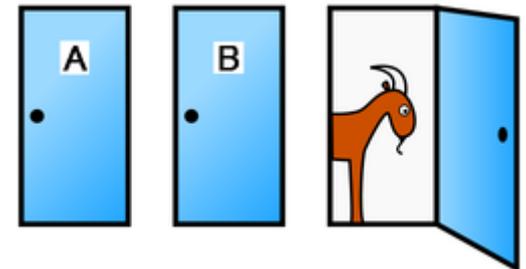
Examples

## Ex 1. Monty Hall problem --- ask Marilyn

- ✓ You are given the choice of three doors:
  - Behind one door is a **car**; behind the others **goats**.
- ✓ You pick a door, say "A".
- ✓ The host (Monty), who knows what's behind the doors, opens another door, say "C", which he knows has a goat.
- ✓ He then says to you, "Do you want to pick door "B"?"

### Question

Is it to your advantage to switch your choice?

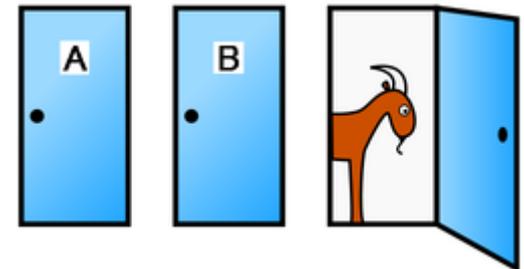


## Ex 1. A modified Monty Hall problem --- ask Marilyn

- ✓ You are given the choice of 26 doors:
  - Behind one door is a car; behind the others goats.
- ✓ You pick a door, say "A".
- ✓ The host (Monty), who knows what's behind the doors, opens all other doors, say "C" to "Z", except for "B", each of which he knows has a goat.
- ✓ He then says to you, "Do you want to pick door "B"?"

### Question

Is it to your advantage to switch your choice?

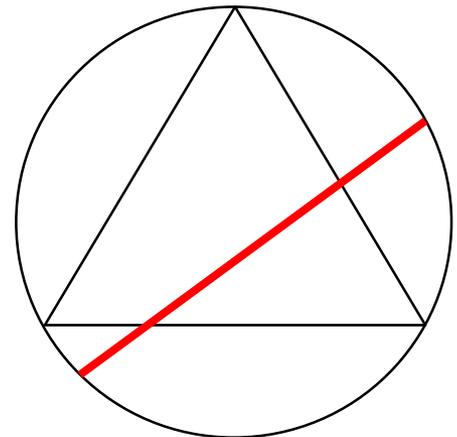


## Ex 2. Bertrand paradox

- ✓ Consider an equilateral triangle inscribed in a circle.
- ✓ Suppose a chord of the circle is chosen at random.

### Question

What is the probability that the chord is longer than a side of the triangle?



## Ex 2. Bertrand paradox

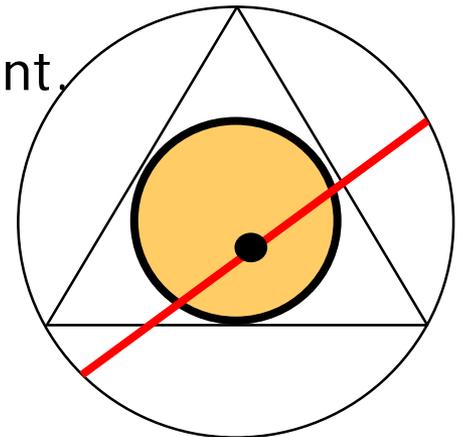
- ✓ Consider an equilateral triangle inscribed in a circle.
- ✓ Suppose a chord of the circle is chosen at random.

### Question

What is the probability that the chord is longer than a side of the triangle ( $=:x$ )?

Answer 1: The "random midpoint" method.

- ✓ Choose a point anywhere within the circle, and construct a chord with the chosen point as its midpoint.
  - ✓ The chord is longer than  $x$  iff the chosen point within a small circle.
- $\Rightarrow$  the probability is  $1/4$



## Ex 2. Bertrand paradox

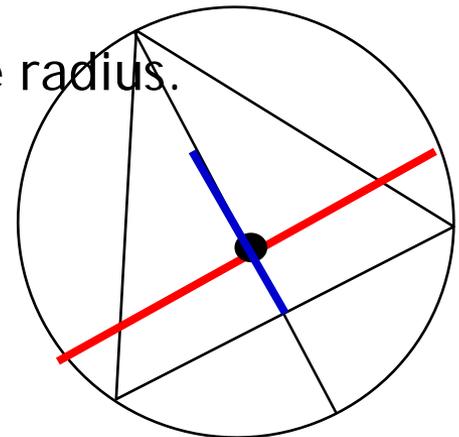
- ✓ Consider an equilateral triangle inscribed in a circle.
- ✓ Suppose a chord of the circle is chosen at random.

### Question

What is the probability that the chord is longer than a side of the triangle ( $=:x$ )?

Answer 2: The "random radius" method:

- ✓ Choose a radius of the circle and a point on the radius.  
the chord through this point and perpendicular to the radius.
  - ✓ The chord is longer than  $x$   
iff the chosen point on a blue line.
- $\Rightarrow$  the probability is  $1/2$



## Ex 2. Bertrand paradox

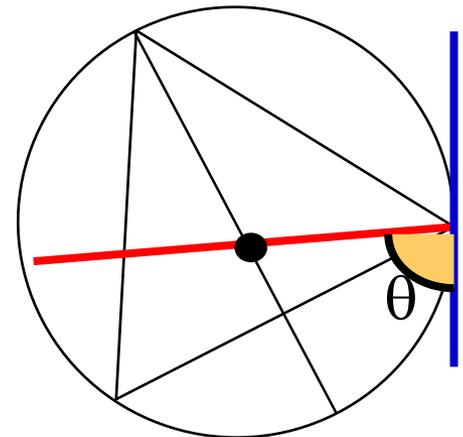
- ✓ Consider an equilateral triangle inscribed in a circle.
- ✓ Suppose a chord of the circle is chosen **at random**.

### Question

What is the probability that the chord is longer than a side of the triangle ( $=:x$ )?

Answer 3: The "random endpoints" method::

- ✓ Choose two random points on the circumference of the circle and draw the chord joining them.
  - ✓ The chord is longer than  $x$   
iff  $\pi/3 \leq \theta \leq 2\pi/3$
- $\Rightarrow$  the probability is  $1/3$



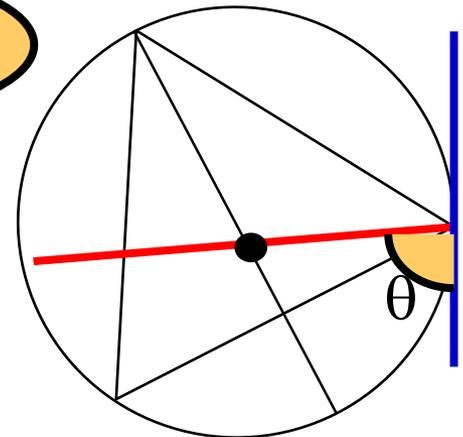
## Ex 2. Bertrand paradox

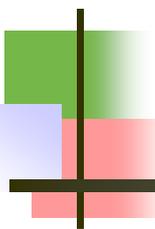
- ✓ Consider an equilateral triangle inscribed in a circle.
- ✓ Suppose a chord of the circle is chosen at random.

### Question

What is the probability that the chord is longer than a side of the triangle ( $=:x$ )?

What does  
"a chord of the circle is chosen at random"  
mean?





# Probability Space

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- ✓ Definitions
- ✓ Axiom
- ✓ Terminology

## Definition: Probability Space

A probability space is defined by  $(\Omega, \mathcal{F}, P)$

$\Omega$ : **sample space**(標本空間); a set of **elementally events**(標本点),

➤ an **event**(事象) is a subset of  $\Omega$ .

$\mathcal{F}$ :  **$\sigma$ -algebra** ( $\subseteq 2^\Omega$ ); a set of events.

$P$ : **probability measure**(確率測度); a function  $\mathcal{F} \rightarrow \mathbb{R}$ ,

➤ probability of an event.

$\mathcal{F}$  is a  **$\sigma$ -algebra**

1.  $\mathcal{F}$  contains the empty set:  $\emptyset \in \mathcal{F}$
2.  $\mathcal{F}$  is closed under complements:  $A \in \mathcal{F} \Rightarrow \bar{A} \in \mathcal{F}$
3.  $\mathcal{F}$  is closed under countable unions:  $A_i \in \mathcal{F} \Rightarrow \bigcup_i A_i \in \mathcal{F}$

## Definition: Probability Space

A probability space is defined by  $(\Omega, \mathcal{F}, P)$

$\Omega$ : **sample space**(標本空間); a set of **elementally events**(標本点),

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$P$ : **probability measure**(確率測度); a function  $\mathcal{F} \rightarrow \mathbb{R}$ ,

➤ probability of an event.

$P$  is a **probability measure** (Kolmogorov axioms)

1.  $P(A) \geq 0$  for any  $A \in \mathcal{F}$ .

2.  $P(\Omega) = 1$ .

3. Any countable sequence of mutual exclusive events  $A_1, A_2, \dots$  satisfies that  $P(A_1 \cup A_2 \cup \dots) = P(A_1) + P(A_2) + \dots$ .

## Example: Probability Space

A probability space is defined by  $(\Omega, \mathcal{F}, P)$

$\Omega$ : **sample space**(標本空間); a set of **elementally events**(標本点),

➤ an **event**(事象) is a subset of  $\Omega$ .

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$P$ : **probability measure**(確率測度); a function  $\mathcal{F} \rightarrow \mathbb{R}$ ,

➤ probability of an event.

### Ex. 1. Die

✓  $\Omega = \{1, 2, 3, 4, 5, 6\},$

✓  $\mathcal{F} = 2^\Omega$

✓  $P(A) = \frac{|A|}{6}$  for any  $A \subseteq \Omega$ .

## Example: Probability Space

A probability space is defined by  $(\Omega, \mathcal{F}, P)$

$\Omega$ : sample space(標本空間); a set of elementally events(標本点),

➤ an event(事象) is a subset of  $\Omega$ .

$\mathcal{F}$ :  $\sigma$ -algebra ( $\subseteq 2^\Omega$ ); a set of events.

$P$ : probability measure(確率測度); a function  $\mathcal{F} \rightarrow \mathbb{R}$ ,

➤ probability of an event.

### Ex. 2. product of a pair of dice cast

Suppose we can only observe the parity of the product  $x \cdot y$  of a pair of casts  $(x, y)$ .

✓  $\Omega = \{(1, 1), (1, 2), (1, 3), \dots, (4, 5), (4, 6), (5, 6)\}$ ,

✓  $\mathcal{F} = \{\emptyset, \text{even}, \text{odd}, \Omega\}$ ,

✓  $P(\emptyset) = 0$ ,  $P(\text{even}) = ?$ ,  $P(\text{odd}) = ?$ ,  $P(\Omega) = 1$ . => exercise

## Property of Probability (1/2)

Kolmogorov's axiom (P1), (P2), (P3) implies the following.

### Thm. 1

Let  $(\Omega, \mathcal{F}, P)$  be an arbitrary probability space.

(1)  $P(\emptyset) = 0$ .

(2) If  $A \subseteq B$  ( $A, B \in \mathcal{F}$ ), then  $P(B \setminus A) = P(B) - P(A)$ .  
(rem.  $B \setminus A = B \cap \bar{A}$ )

(3) If  $A \subseteq B$  ( $A, B \in \mathcal{F}$ ), then  $P(A) \leq P(B)$ .

(4)  $P(A) \leq 1$  for any  $A \in \mathcal{F}$ .

(5)  $P(\bar{A}) = 1 - P(A)$  for any  $A \in \mathcal{F}$ .

## Property of Probability (2/2)

Kolmogorov's axiom (P1), (P2), (P3) implies the following.

### Thm. 1. (cont.)

(6)  $P(A \cup B) = P(A) + P(B) - P(A \cap B)$  for any  $A \in \mathcal{F}$ .

(7) If  $A_1, A_2, \dots \in \mathcal{F}$  satisfy  $A_1 \subseteq A_2 \subseteq \dots$ ,

$$\text{then } P(\cup_i A_i) = \lim_{n \rightarrow \infty} P(A_n)$$

(8) If  $A_1, A_2, \dots \in \mathcal{F}$  satisfy  $A_1 \supseteq A_2 \supseteq \dots$ ,

$$\text{then } P(\cap_i A_i) = \lim_{n \rightarrow \infty} P(A_n)$$

(9) For any  $A_1, A_2, \dots \in \mathcal{F}$ ,

$$P(\cup_i A_i) = 0 \Leftrightarrow \forall i \geq 0, P(A_i) = 0$$