# Review of Selected Topics in Probability

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Lecture 2

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- There are two rounds:
  - In the first round the contestant chooses a door and then the organizers open one of the (remaining) empty ones.
  - In the second round there are two options for the contestant:
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Question: Which strategy should the contestant follow?

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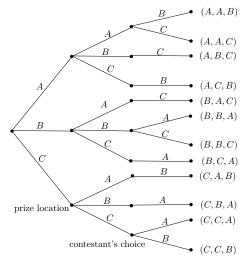
Quiz: How many possible outcomes are there?

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Quiz: How many possible outcomes are there? (a) 3<sup>3</sup> (b) 12 (c) 15 (d) Something else.

### Sample Space for Monty Hall



door revealed

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Example: Let  $S_w$  be the set of outcomes for which the contestant wins if he employs the "stick" strategy. Then

 $S_{w} = \{(A, A, B), (A, A, C), (B, B, A), (B, B, C), (C, C, A), (C, C, B)\}$ 

**Step 3:** Compute outcome probabilities, i.e. determine the probability space.

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### Definition (Probability Space)

The probability space of an experiment consists of the sample space S and a function  $\Pr: S \to \mathbb{R}$  such that

1. 
$$0 \leq \Pr(w) \leq 1$$
, for all atomic events  $w \in S$ .  
2.  $\sum_{w \in S} \Pr(w) = 1$ .

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- 1. The prize is behind a door with probability  $\frac{1}{3}$ .
- 2. The contestant chooses a door equiprobably.
- 3. If the organizers have a choice for which door to open, they choose one equiprobably.

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Example: In the Monty Hall problem  $Pr(A, A, C) = \frac{1}{3} \cdot \frac{1}{3} \cdot \frac{1}{2} = \frac{1}{18}$ and  $Pr(A, B, C) = \frac{1}{3} \cdot \frac{1}{3} \cdot 1 = \frac{1}{9}$ .

**Step 4:** Compute event probabilities; for any event  $S' \in S$ ,

$$\Pr(S') = \sum_{w \in S'} \Pr(w). \tag{1}$$

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Example: Let  $S_w$  and  $D_w$  be the events that the contestant wins if he employs the "stick" strategy or the "change" strategy respectively. Then

$$\Pr(S_w) = 6 \cdot \frac{1}{18} = \frac{1}{3}$$
$$\Pr(D_w) = 6 \cdot \frac{1}{9} = \frac{2}{3}.$$

and

# Probability and Counting

# Theorem (Equiprobable atomic events)

Let S be a sample space and for any atomic events w, w', Pr(w) = Pr(w'), then

$$\Pr(A) = \frac{\# \ atomic \ events \ in \ A}{\# \ atomic \ events \ in \ S}.$$
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Use with caution!! Makes computing probabilities easier ONLY when atomic events are equiprobable; extra care is needed when defining the sample space.

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Consider a random 3-length DNA sequence (using A, C, T, G) in which each of the 4<sup>3</sup> possible (ordered) outcomes are equally likely to appear. What is the probability that we get the sequence TGA when the order does matter (i.e.  $TGA \neq TAG$ ) and when not (i.e. TGA = TAG)?

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(a) 
$$\frac{1}{4^3}$$
 and  $\frac{1}{4^3}$ .

(b) 
$$\frac{1}{4^3}$$
 and  $\frac{1}{\binom{4+3-1}{3}}$ 

(c) 
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Answer: (d)

# Another Quiz

Suppose we have 2 white balls and 2 black balls and we randomly choose 2 of them. What is the probability that the pair that we choose is of different color when (i) balls of the same color are identical and (ii) when all 4 balls are distinct and the order matters?

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(a)	$\frac{1}{2}$ in both cases.
(b)	$\frac{1}{2}$ and $\frac{2}{3}$
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Answer: Homework! (Do not use conditional probability)

# Yet Another Quiz - Balls in Bins

Suppose we have m distinct bins and n balls, which we place randomly inside the bins. What is the probability that the first bin remains empty?

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Answer: (a)

# Axiomatic Definition of Probability

Definition (Probability - alternative definition) Probability is a function  $Pr : 2^{S} \to \mathbb{R}$  such that

1. 
$$\Pr(A) \geq 0, \forall A \subseteq S$$
.

- 2. Pr(S) = 1.
- 3. If  $A \cap B = \emptyset$ ,  $\Pr(A \cup B) = \Pr(A) + \Pr(B)$  (Sum Rule, special case).

### Some Properties of Probability

For any given sample space S and any events  $A, B, A_1, \ldots, A_n$ :

- ▶  $\Pr(A) \in [0, 1].$
- $\Pr(\bar{A}) = 1 \Pr(A)$ .
- ▶  $\Pr(A \cup B) = \Pr(A) + \Pr(B) \Pr(A \cap B).$
- ▶  $\Pr(A_1 \cup \cdots \cup A_n) \leq \Pr(A_1) + \cdots + \Pr(A_n)$  (Boole's inequality).