

Introduction to Discrete Math

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- 1 -

Global Frontier College

- Mathematical Thinking
 - Convincing Arguments, Find Example, Recursion & Induction, Logic, Invariants
- Probability & Combinatorics
 - Basic Counting, Binomial Coeff, Advanced Counting, Probability, **Random Variables**

Probability & Combinatronics – Random Variables

RANDOM VARIABLES & EXPECTATIONS

- **Random Variables**
- Average
- Expectation

Random Variables

- We have studied probability distributions
- Studied **events** (subsets of outcomes) and their probabilities
- Events correspond to **yes or no questions**
- It is important to study **numerical characteristics** of random outcomes
- So we introduce **random variables**



Random Variables

- **Random variable f** is a variable whose value is determined by a random experiment
- We have probability distribution on the finite set X of k outcomes
- Outcomes have probabilities p_1, \dots, p_k
- To define f we assign a number a_i to each outcome
- Then f has value a_i with probability p_i

Random Variables

- Looks **familiar**?
 - We have already **done** this!
- **Outcomes** of the dice throw are labeled by numbers



Random Variables

Other examples:

- **Tossing** a coin: heads=0, tail=1
- An **age** of a random person in the class
- **Grade** of a random person in the class
- **Sum** of outcomes of two dice throws

- Random Variables
- **Average**
- Expectation

Average

What is an **average** salary in a country?

- The **total** salary of all population **divided** by the number of employees
- This is the **standard notion of average**
- It is called **arithmetic mean** in mathematics

Example

Problem: Student got scores 78, 72 and 87 on three tests.
What is the **average** score?

- Have to add all scores and divide by their number

Example

Problem: Student got scores 78, 72 and 87 on three tests.
What is the **average** score?

- Have to add all scores and divide by their number
- Here it is:

$$\frac{78 + 72 + 87}{3} = \frac{237}{3} = 79$$

- We **got lucky** and the answer is integer
- but this is **not guaranteed**

Handwritten calculation showing the sum of scores and the result:

$$\begin{array}{r} 78 \quad 72 \quad 87 \\ 78 \quad 79 \quad 80 \\ 79 \quad 79 \quad 79 \end{array}$$

HR Management Strategy

Problem: Suppose HR management in some company uses the following strategy: fire everyone who performs **below average**. What will be a result of such strategy?

- Might sound reasonable, but ...
- Unless everyone works equally (extremely rare case) ...
- There is always someone who works below average!
 - If we fire them, the average performance will grow
- New people get below average!
 - Everyone will be fired except **one best employee**

~~1 58~~
~~2 55~~
~~3 55~~
~~4 55~~
~~5 80~~
~~6 100~~ }
~~7 55~~
~~8 84~~
~~9 90~~ 97.7%
~~10 73~~
 = 98% | 95% | 99%

Average Outcome of Dice Throw

Problem: Suppose we throw a dice many times. What is the **average** outcome?

- Can we give a precise answer?
 - No, it is a random variable
- But we can give an approximation that is good with high probability

Average Outcome of Dice Throw

- Suppose we throw a dice n times for a very large n
- Then among outcomes there are approximately $n/6$ ones, $n/6$ twos, and so on...
- The **sum** of results is then approximately

$$\left\{ \frac{n}{6} \times 1 \right\} + \left\{ \frac{n}{6} \times 2 \right\} + \left\{ \frac{n}{6} \times 3 \right\} + \left\{ \frac{n}{6} \times 4 \right\} + \left\{ \frac{n}{6} \times 5 \right\} + \left\{ \frac{n}{6} \times 6 \right\}$$
$$= \frac{n(1 + 2 + 3 + 4 + 5 + 6)}{6} = \frac{21n}{6} = \underline{3.5n}$$

- The **average** can be obtained by dividing with number of throws n
- Thus the average is approximately: $\frac{3.5n}{n} = \underline{3.5}$
- This is an **expected value** or **expectation** of a dice throw

- Random Variables
- Average
- **Expectation**



Expectation

Let's consider the **general case**

- Suppose we have a **random variable f** on the distribution **with 4 outcomes**
- Probabilities of outcomes are p_1 , p_2 , p_3 , p_4
- Values of f are a_1 , a_2 , a_3 , a_4
- Let's **repeat the random experiment** many times

Expectation

$$\underbrace{\quad}_{p_1} \quad \underbrace{\quad}_{p_2} \quad \underbrace{\quad}_{p_3} \quad \underbrace{\quad}_{p_4}$$

Expectation

$$\underbrace{\quad}_{p_1} \quad \underbrace{\quad}_{p_2} \quad \underbrace{\quad \bullet}_{p_3} \quad \underbrace{\quad}_{p_4}$$

Expectation



Expectation

$$\begin{array}{cccc} \underbrace{\quad \bullet \quad} & \underbrace{\quad} & \underbrace{\quad \vdots \quad} & \underbrace{\quad} \\ p_1 & p_2 & p_3 & p_4 \end{array}$$

Expectation

$$\begin{array}{cccc} \begin{array}{|c|} \hline \bullet \\ \hline \end{array} & \begin{array}{|c|} \hline \bullet \\ \hline \end{array} & \begin{array}{|c|} \hline \bullet \\ \bullet \\ \hline \end{array} & \begin{array}{|c|} \hline \\ \hline \end{array} \\ p_1 & p_2 & p_3 & p_4 \end{array}$$

Expectation

$$\begin{array}{cccc} \begin{array}{c} \cdot \\ \hline \end{array} & \begin{array}{c} \cdot \\ \hline \end{array} & \begin{array}{c} \cdot \\ \hline \end{array} & \begin{array}{c} \cdot \\ \hline \end{array} \\ p_1 & p_2 & p_3 & p_4 \end{array}$$

Expectation

$$\begin{array}{cccc} \begin{array}{c} \vdots \\ \hline \end{array} & \begin{array}{c} \bullet \\ \hline \end{array} & \begin{array}{c} \vdots \\ \hline \end{array} & \begin{array}{c} \hline \end{array} \\ p_1 & p_2 & p_3 & p_4 \end{array}$$

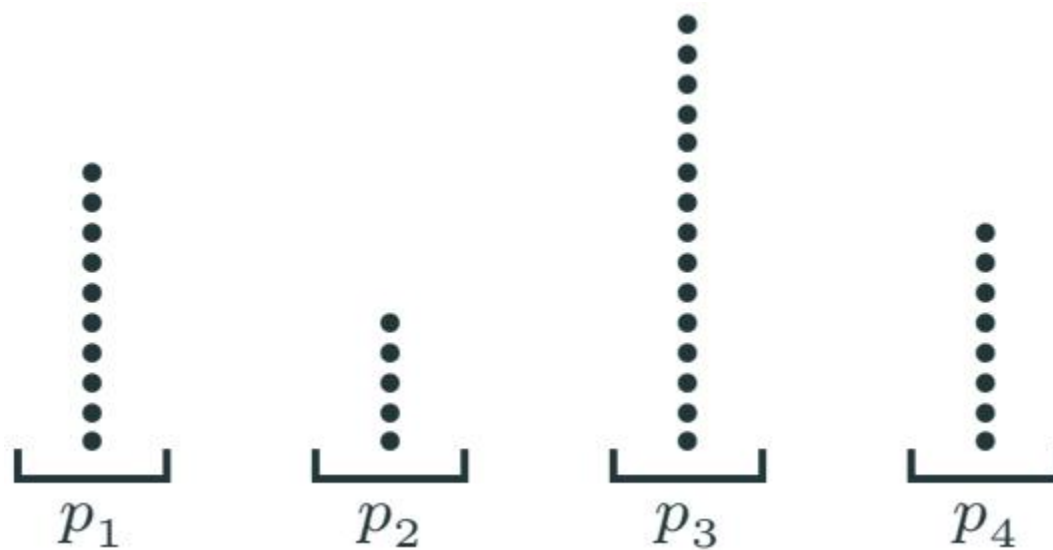
Expectation

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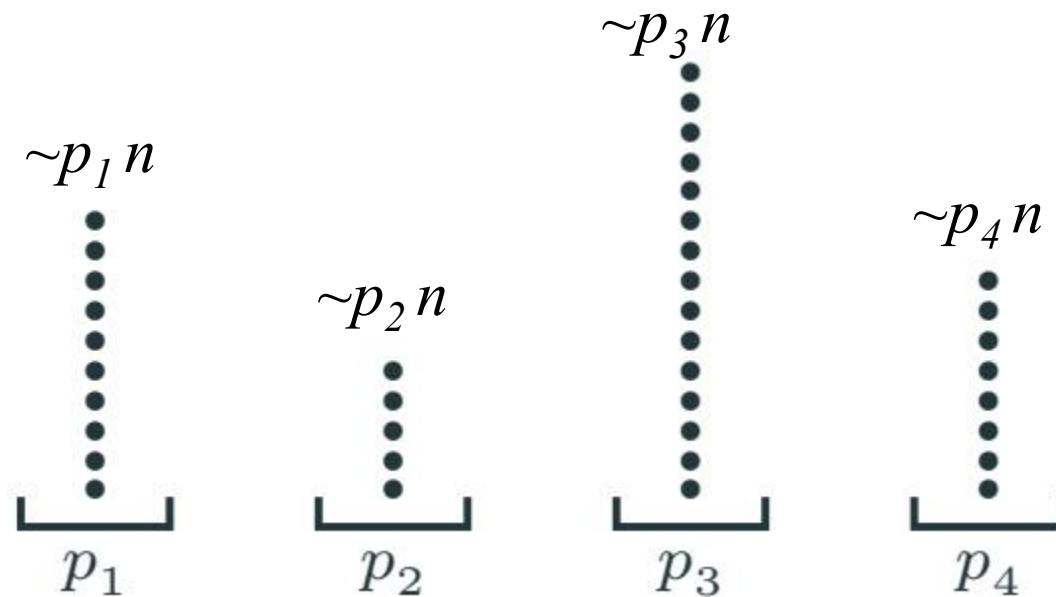
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Expectation



- Repeat n times, where n is large

Expectation



- Repeat n times, where n is large
- What is the average value of f on these outcomes?

Expectation

- We have n experiments
- Value a_i occurs about $p_i n$ times
- On average we have:

$$\begin{aligned} & \sim \frac{a_1 p_1 n + a_2 p_2 n + a_3 p_3 n + a_4 p_4 n}{n} \\ & = a_1 p_1 + a_2 p_2 + a_3 p_3 + a_4 p_4 \end{aligned}$$

- This is denoted by Ef and called the **expectation of f**
- Does **not** depend on n
- An **approximation** to what we would expect as an average outcome of an experiment repeated many times



Expectation

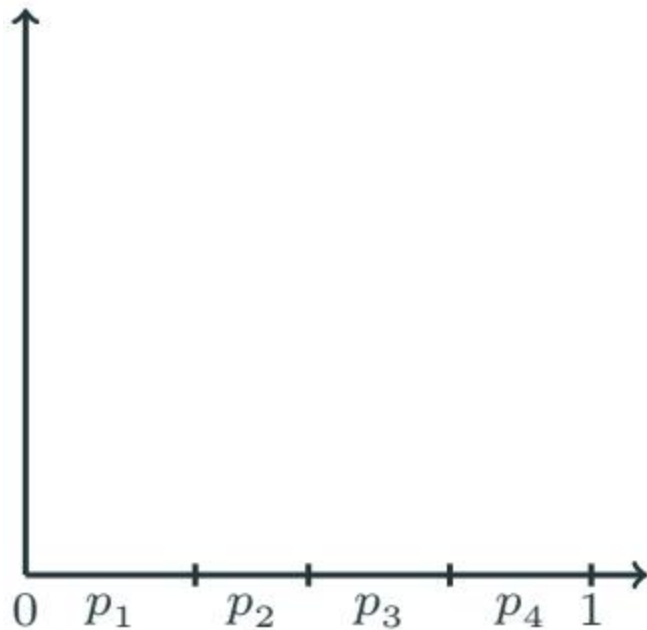
- In the **general case**:
outcomes a_1, \dots, a_k with probabilities p_1, \dots, p_k
- To compute the expectation:
 - multiply $a_i \times p_i$ over all i
 - And add up through 1 to k
- Expectation is a **number**!
- An **important** characteristic of a random variable

Geometric Representation of Expectation

Suppose f :

- obtains values a_1, a_2, a_3, a_4 with probabilities p_1, p_2, p_3, p_4

- $\underline{E}f = a_1p_1 + a_2p_2 + a_3p_3 + a_4p_4$

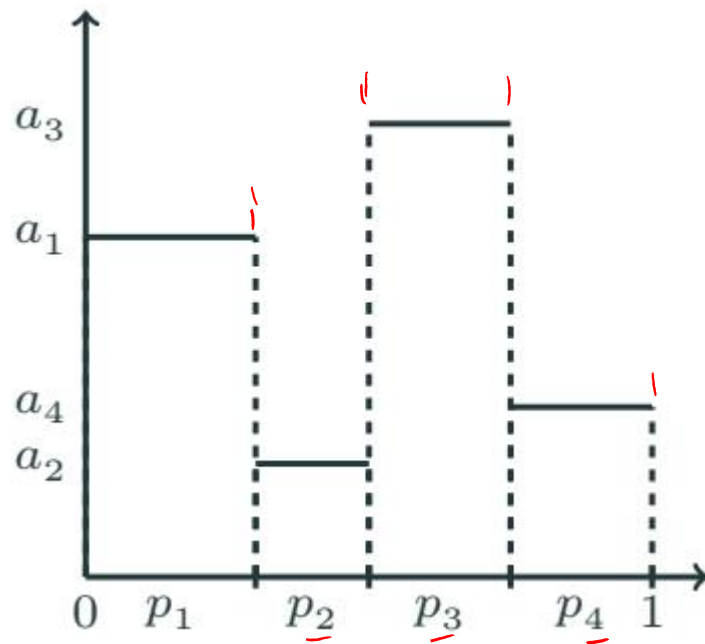


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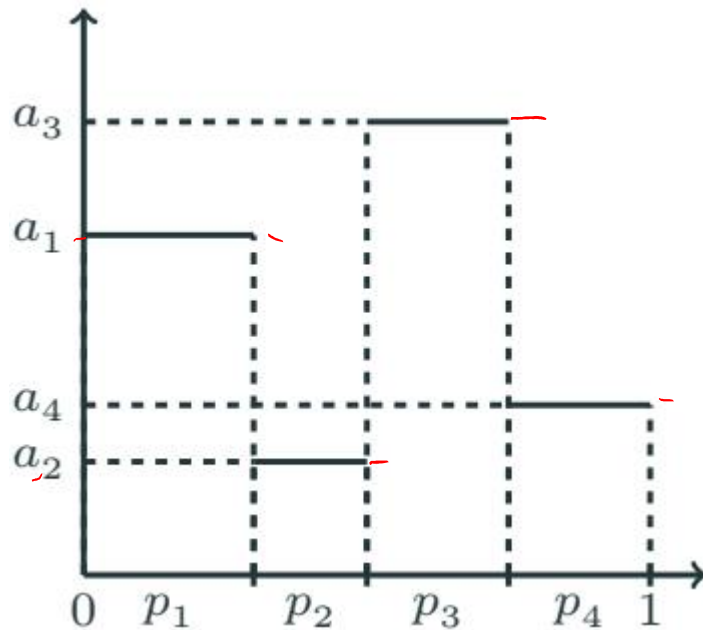


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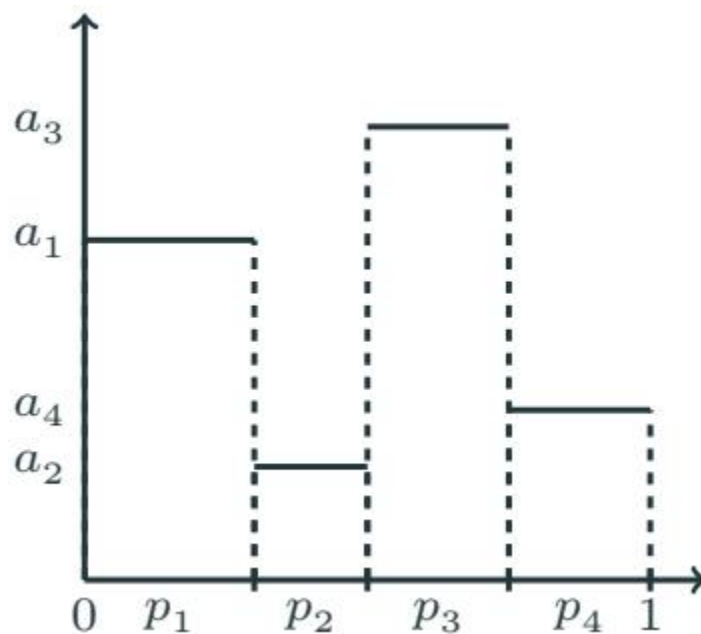


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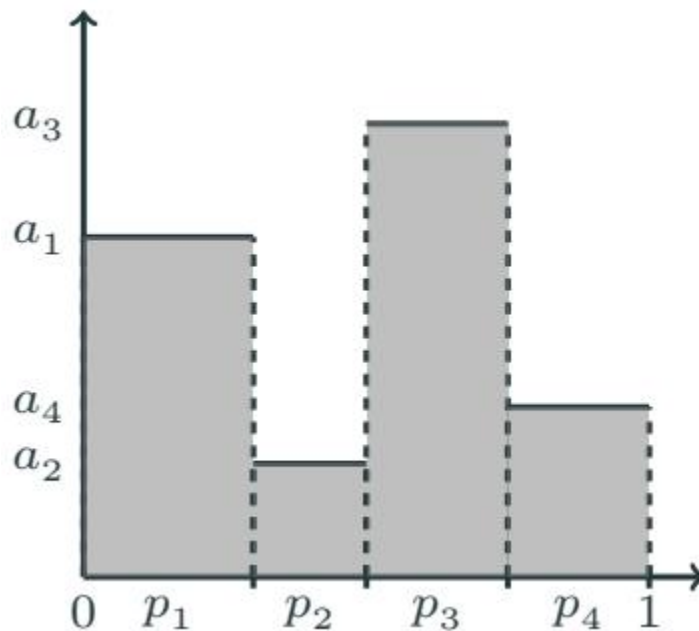


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- Ef is the area of the gray region

Real Life Examples

- Expectations occur **everywhere** in statistics and sociology
- Average **age**
- Life **expectancy**
- Average **grades** and **evaluations**

Thank you.