



Sample space of sequences: coin

100A

Xiaowu Dai

Basics

Population

Region

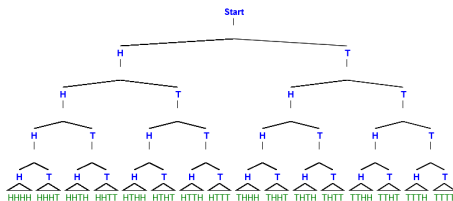
Coin

Markov

Reasoning

Flip a fair coin n times independently.

Sample space Ω_n : all possible sequences of heads and tails.



$$|\Omega_n| = 2^n.$$

$$\Omega_n = \Omega_1 \times \Omega_1 \times \dots \times \Omega_1 = \Omega_1^n.$$

Ω_1 : base sample space of flipping the fair coin once.

Ω_n : hyper sample space of flipping n times independently.

Population of sequences.





Sample space of sequences: die

100A

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Basics

Population

Region

Coin

Markov

Reasoning

Roll a fair die n times independently.

Sample space Ω_n : all possible sequences of numbers.

	1	2	3	4	5	6
1	(1,1)	(1,2)	(1,3)	(1,4)	(1,5)	(1,6)
2	(2,1)	(2,2)	(2,3)	(2,4)	(2,5)	(2,6)
3	(3,1)	(3,2)	(3,3)	(3,4)	(3,5)	(3,6)
4	(4,1)	(4,2)	(4,3)	(4,4)	(4,5)	(4,6)
5	(5,1)	(5,2)	(5,3)	(5,4)	(5,5)	(5,6)
6	(6,1)	(6,2)	(6,3)	(6,4)	(6,5)	(6,6)

$$|\Omega_n| = 6^n.$$

$$\Omega_n = \Omega_1 \times \Omega_1 \times \dots \times \Omega_1 = \Omega_1^n.$$

Ω_1 : base sample space of rolling the fair die once.

Ω_n : hyper sample space of rolling n times independently.

Population of sequences.





Sample space of sequences: population

100A

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Basics

Population

Region

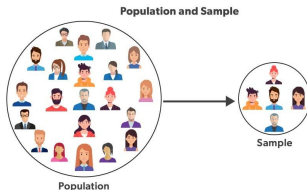
Coin

Markov

Reasoning

Randomly sample a person from a population of N (e.g., 300 million) people.

Repeat random sampling n (e.g., 1000) times independently.
Sample space Ω_n : all possible sequences of people.



$$|\Omega_n| = N^n \text{ (e.g., } 300m^{1000}\text{)}.$$

$$\Omega_n = \Omega_1 \times \Omega_1 \times \dots \times \Omega_1 = \Omega_1^n.$$

Ω_1 : base sample space, the population of people.

Ω_n : hyper sample space, the hyper-population of sequences.

Population of sequences.





Sample space of sequences: region

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Basics

Population

Region

Coin

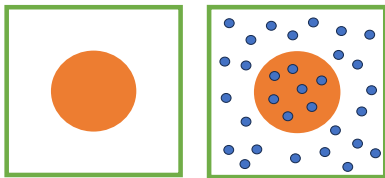
Markov

Reasoning

Randomly sample a point from a region.

Repeat the above n times independently.

Sample space Ω_n : all possible sequences of points.



$$\Omega_n = \Omega_1 \times \Omega_1 \times \dots \times \Omega_1 = \Omega_1^n.$$

Ω_1 : base sample space, unit square $[0, 1]^2$.

Ω_n : hyper sample space, unit hyper-cube $[0, 1]^{2n}$.

$(x_1, y_1, x_2, y_2, \dots, x_n, y_n)$: a point in Ω_n .

Population of sequences.





Population of sequences

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Basics

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Markov

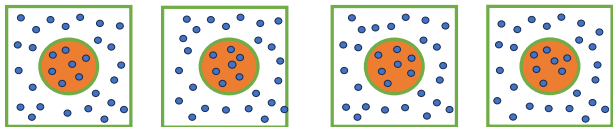
Reasoning

Equally likely outcomes in Ω_1 + independent repetitions
= equally likely sequences in Ω_n .

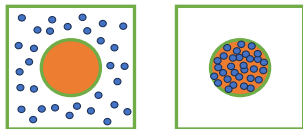
m : number of times A happens.

m fluctuates over all sequences.

Among all equally likely possibilities, 99.999% are like below,
where m/n is close to $P(A)$.



.00000001% are like below, where m/n are far from $P(A)$.





Convergence in probability, concentration of measure, law of large number

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Region

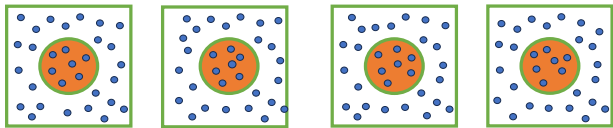
Coin

Markov

Reasoning

All sequences in Ω_n are equally likely.

Among all equally likely possibilities, 99.999% are like below, where m/n is close to $P(A)$.



Can prove $P(|\frac{m}{n} - P(A)| \leq .01) \rightarrow 1$ as $n \rightarrow \infty$.

A representative sequence: $|m(\text{sequence})/n - P(A)| \leq .01$.

A non-representative sequence: $|m/n - P(A)| > .01$.

Among all possible sequences, the proportion of representative sequences $\rightarrow 1$ as $n \rightarrow \infty$.

(1) Population setting: count the number of sequences.

(2) Region setting: measure the volume of set of sequences.



Permutation

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Basics

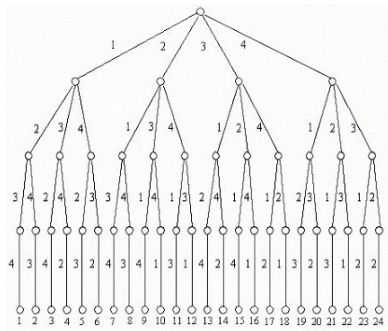
Population

Region

Coin

Markov

Reasoning



n different cards. Choose k of them. Order matters. Number of different sequences:

$$P_{n,k} = n(n-1)\dots(n-k+1). \quad P_{4,2} = 4 \times 3 = 12.$$

$$P_{n,n} = n!.$$

How many different ways to permute things.



Combination

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Basics

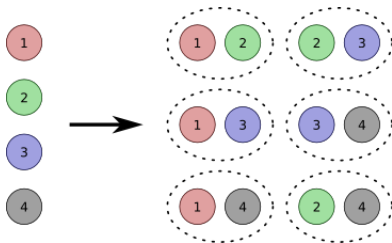
Population

Region

Coin

Markov

Reasoning



n different balls. Choose k of them. Order does NOT matters.
Number of different combinations:

$$\binom{n}{k} = \frac{P_{n,k}}{k!} = \frac{n(n-1)\dots(n-k+1)}{k!} = \frac{n!}{k!(n-k)!}.$$

$$\binom{4}{2} = \frac{4 \times 3}{2} = 6.$$





Combination

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Basics

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Reasoning



Each combination corresponds to $k!$ permutations.

$$\binom{n}{k} = \frac{P_{n,k}}{k!} = \frac{n(n-1)\dots(n-k+1)}{k!} = \frac{n!}{k!(n-k)!}.$$

$$\binom{4}{2} = \frac{4 \times 3}{2} = 6.$$





Coin flipping

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Basics

Population

Region

Coin

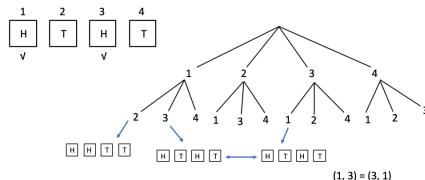
Markov

Reasoning

Example 4: Coin flipping

HHHH, THHH, **HTHT**, TTHT,
 HHHT, **HHTT**, **THHT**, THTT,
 HHTH, **TTHH**, **HTTH**, HTTT,
 HTHH, **HTHT**, TTTH, TTTT

$$A = \{\omega: x(\omega) = 2\}$$



$$|A_2| = \binom{4}{2} = \frac{4 \times 3}{2} = 6.$$

Do not confuse order of picking blanks with order of coin flippings.

In general, flip a fair coin n times independently,

$$P(A_k) = P(\{\omega : X(\omega) = k\}) = P(X = k) = \frac{\binom{n}{k}}{2^n}.$$



Survey sampling

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Basics

Population

Region

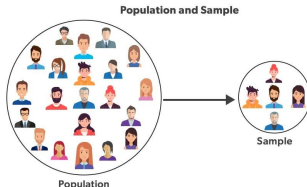
Coin

Markov

Reasoning

Population of N people, M males.

Repeat random sampling n times independently



→ N^n equally likely sequences.

For a sequence ω , $X(\omega)$ = number of males in ω .

$A_m = \{\omega : X(\omega) = m\}$: sequences with m males.

$|A_m| = \binom{n}{m} M^m (N - M)^{n-m}$. n blanks. Choose m blanks for males, the rest $n - m$ blanks for females. Each male blank has M choices. Each female blank has $N - M$ choices.





Survey sampling

100A

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Basics

Population

Region

Coin

Markov

Reasoning

Population of N people. M males.

Sample a person, $p = M/N = \text{Prob}(\text{male})$.

$$\begin{aligned} P(A_m) &= P(X = m) = \frac{|A_m|}{|\Omega_n|} \\ &= \frac{\binom{n}{m} M^m (N - M)^{n-m}}{N^n} \\ &= \binom{n}{m} p^m (1 - p)^{n-m}. \end{aligned}$$

Most sequences are representative, $X/n \approx M/N = p$.





Binomial distribution, probability mass function

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Coin

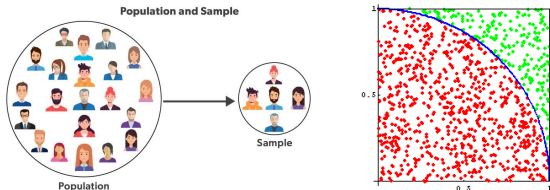
Markov

Reasoning

Flip a coin n times independently, p = probability of head.

$$p(x) = P(X = x) = \binom{n}{x} p^x (1 - p)^{n-x}$$
$$x = 0, 1, \dots, n.$$

$p(x)$: probability mass function, probability distribution.



Survey sampling, poll before election, $p = M/N$.

Monte Carlo, $p = \pi/4$.