



# MATH 20: PROBABILITY

Important Distributions

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# Important Distributions

Discrete Uniform Distribution

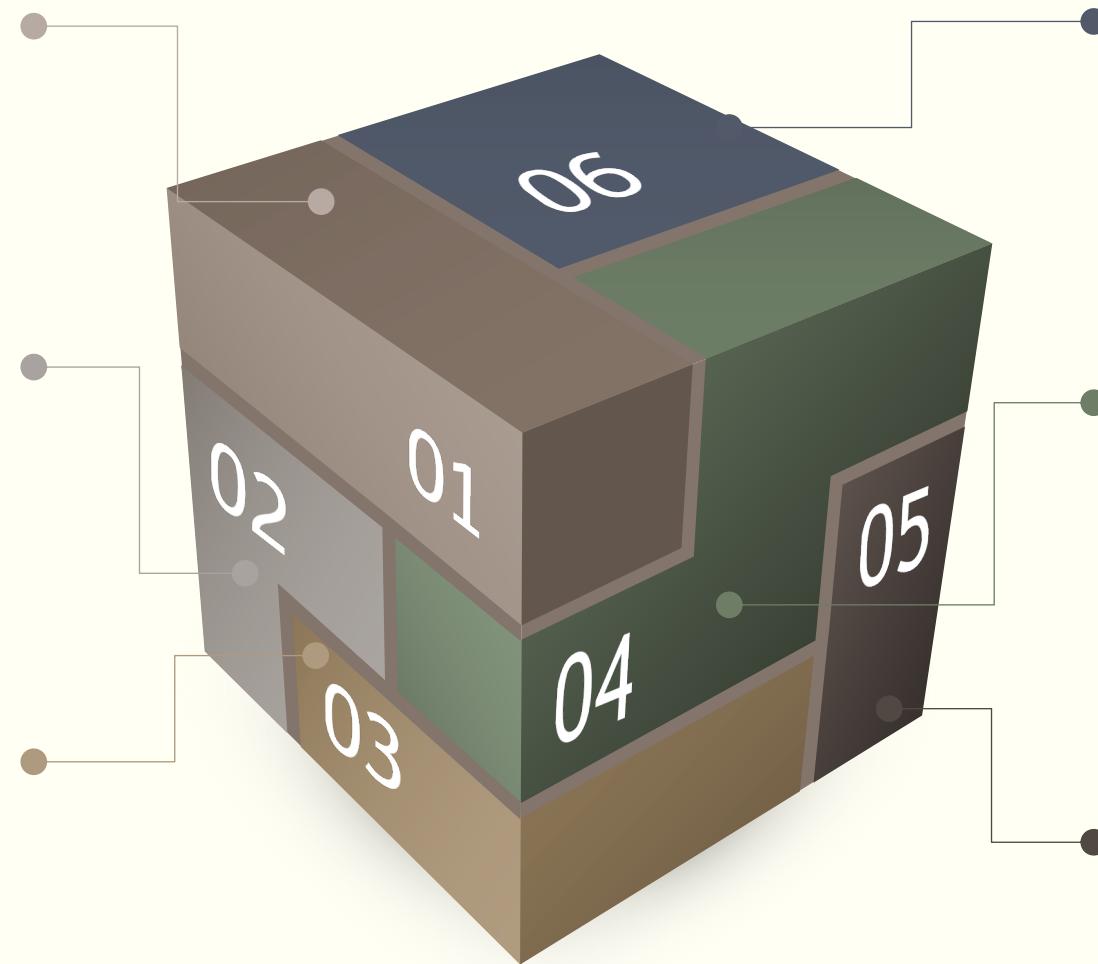
$$m(\omega) = \frac{1}{n}$$

Binomial Distribution

$$b(n, p, k) = \binom{n}{k} p^k q^{n-k}$$

Geometric Distribution

$$P(T = n) = q^{n-1} p$$



Hypergeometric Distribution

$$h(N, k, n, x) = \frac{\binom{k}{x} \binom{N-k}{n-x}}{\binom{N}{n}}$$

Negative Binomial Distribution

$$u(x, k, p) = \binom{x-1}{k-1} p^k q^{x-k}$$

Poisson Distribution

$$P(X = k) = \frac{\lambda^k}{k!} e^{-\lambda}$$

# Discrete Uniform Distribution

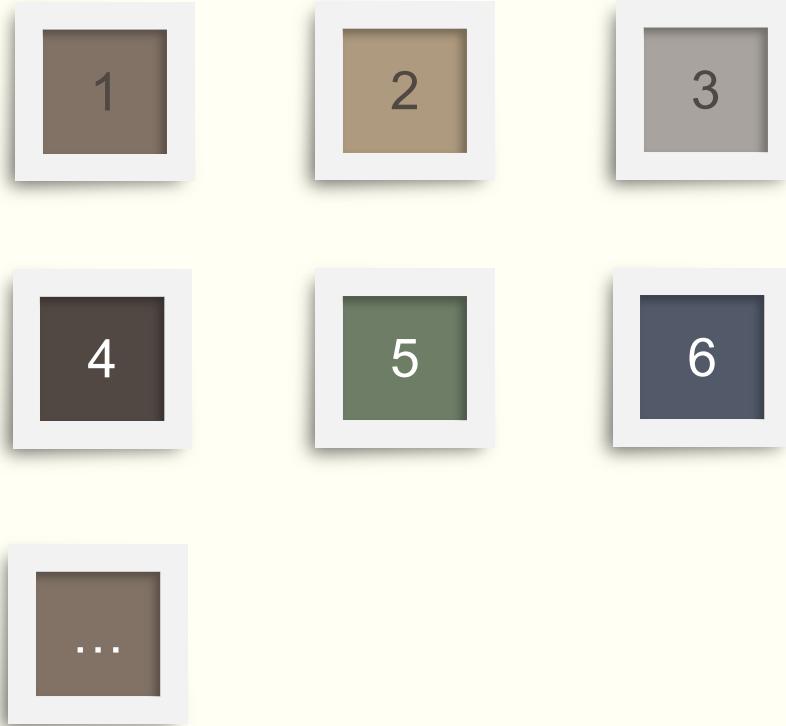
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- In the sample space  $S$ ,  $m(\omega) = \frac{1}{n}$  for all  $\omega \in S$ .

Discrete Uniform Distribution

$$m(\omega) = \frac{1}{n}$$



# Discrete Uniform Distribution

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Toss a coin

head or tail

$$m(\omega) = \frac{1}{2}$$



# Discrete Uniform Distribution

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Roll a dice

1, 2, 3, 4, 5, or 6

$$m(\omega) = \frac{1}{6}$$



Draw a poker card

$$(10 + 3) \times 4$$

$$m(\omega) = \frac{1}{52}$$

Draw a poker card: heart

spade, diamond, club, heart

$$m(\omega) = \frac{1}{4}$$

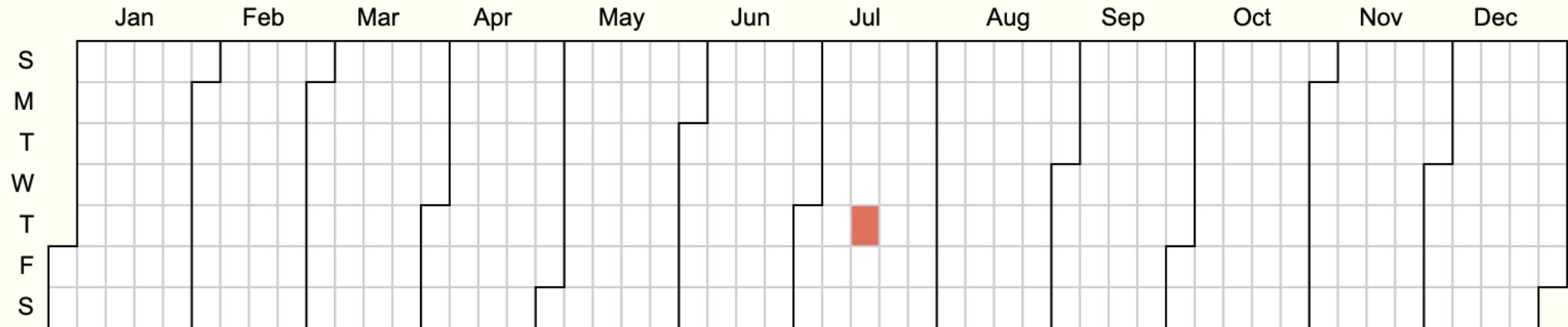
Draw a poker card: Q

1, 2, 3, ..., 10, J, Q, K

$$m(\omega) = \frac{1}{13}$$



# 2021



Pick a date

1, 2, ..., 365

$$m(\omega) = \frac{1}{365}$$

Pick a month

1, 2, ..., 12

$$m(\omega) = \frac{1}{12}$$

Pick a season

spring, summer, fall, winter

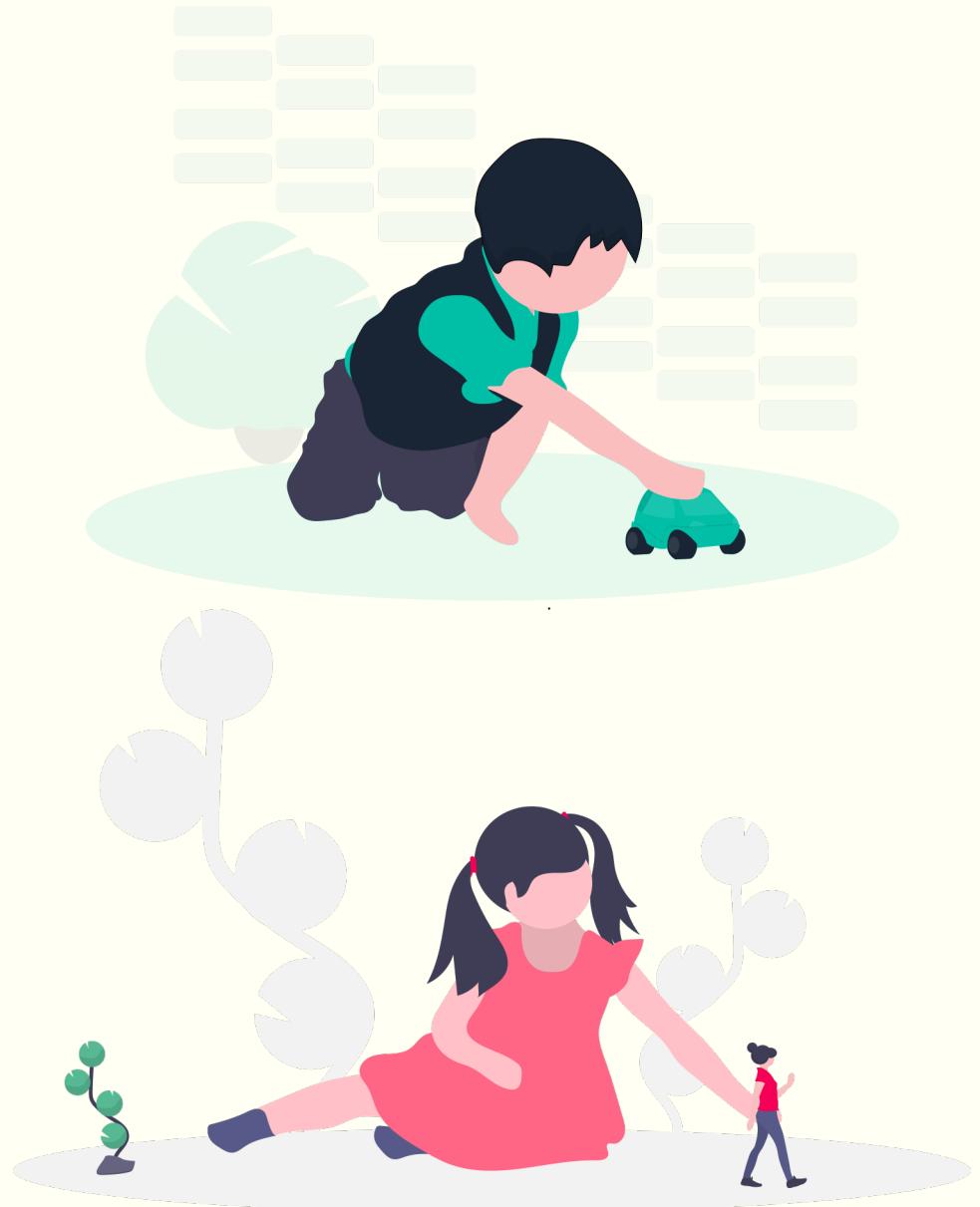
$$m(\omega) = \frac{1}{4}$$

- Suppose you're on a game show, and you're given the choice of three doors: behind one door is a car; behind the others, goats.

Have a baby

boy or girl

$$m(\omega) = \frac{1}{2}$$



# Binomial Distribution

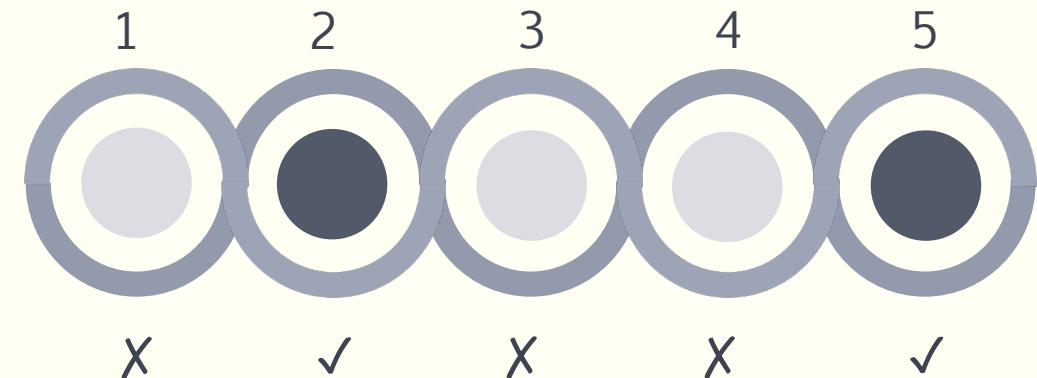
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- Let  $n$  be a positive integer and let  $p$  be a real number between 0 and 1.
- Let  $B$  be the random variable which counts the number of successes in a **Bernoulli trials process** with parameters  $n$  and  $p$ .
- Then the distribution  $b(n, p, k)$  of  $B$  is called the binomial distribution.

Binomial Distribution

$$b(n, p, k) = \binom{n}{k} p^k q^{n-k}$$



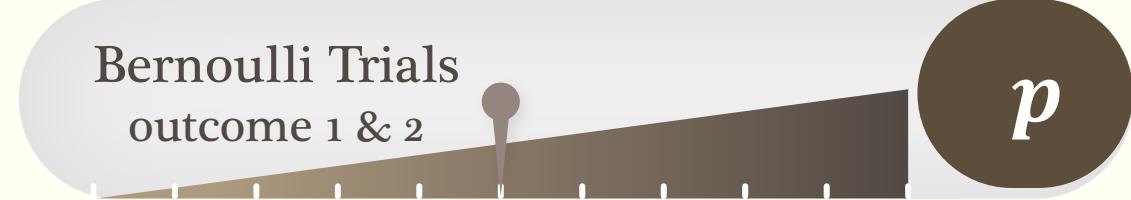
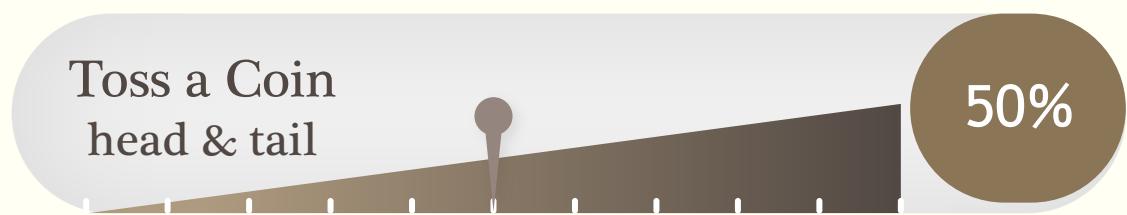
# Bernoulli Trials

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A Bernoulli trials process is a sequence of  $n$  chance experiments such that

- Each experiment has two possible outcomes, which we may call **success** and **failure**.
- The probability  $p$  of success on each experiment is the same for each experiment, and this probability is not affected by any knowledge of previous outcomes. The probability  $q$  of failure is given by  $q = 1 - p$ .





# TOSS A COIN

Toss a coin 5 times. What is the probability that there are 2 flips that land heads?



- \* Suppose you toss a coin 5 times. What is the probability that there are 2 heads? 3 tails?

Toss a coin 5 times. What is the probability that there are 2 heads? 3 tails?

?

### Toss a coin

$$n = 5, p = \frac{1}{2}, k = 2$$

$$b(n, p, k) = b\left(5, \frac{1}{2}, 2\right) = \binom{5}{2} \left(\frac{1}{2}\right)^5$$

# ROLL A DICE

Roll a dice 10 times. What is the probability that 6 is obtained twice?



- \* Suppose you have been given a dice. Roll a dice 10 times. What is the probability that 6 is obtained twice?

Roll a dice 10 times. What is the probability that 6 is obtained twice?

?

### Roll a dice

$$n = 10, p = \frac{1}{6}, k = 2$$

$$b(n, p, k) = b\left(10, \frac{1}{6}, 2\right) = \binom{10}{2} \left(\frac{1}{6}\right)^2 \left(\frac{5}{6}\right)^8$$

# Black or Red



## Monte Carlo Casino

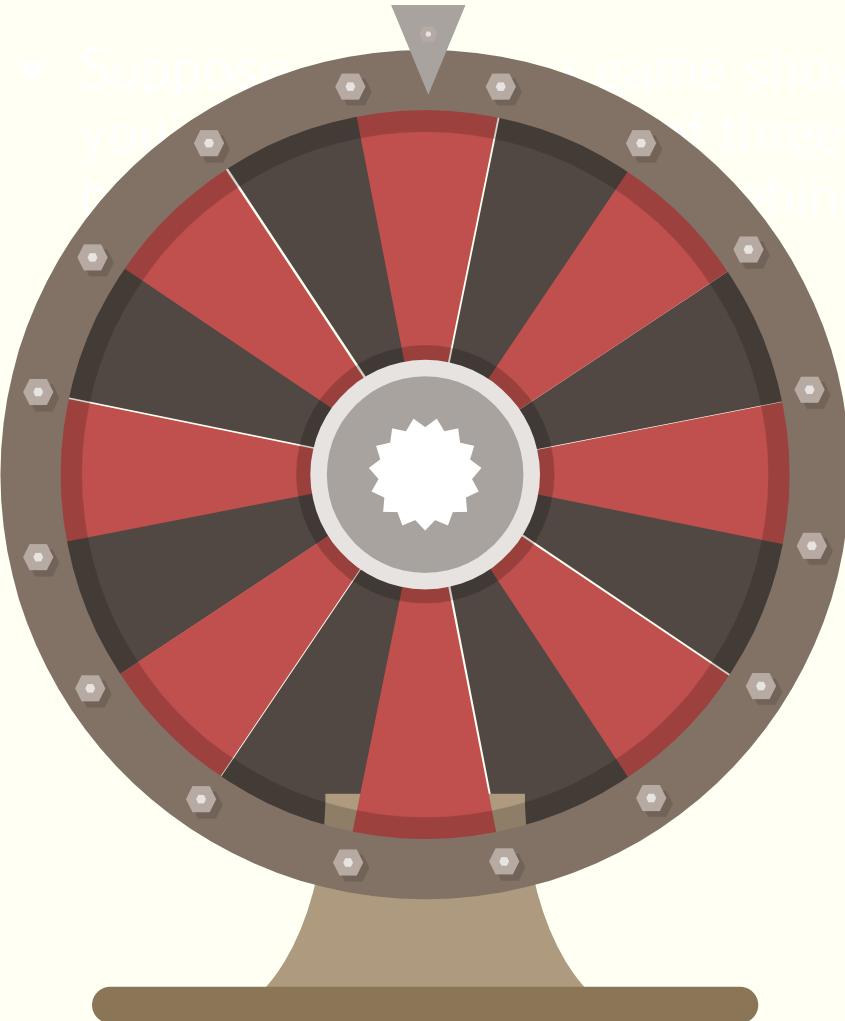
in a game of roulette at the [Monte Carlo Casino](#) on August 18, 1913, the ball fell in black 26 times in a row.

This was an extremely uncommon occurrence: the probability of a sequence of either red or black occurring 26 times in a row is around 1 in 66.6 million, assuming the mechanism is unbiased.

Gamblers lost millions of francs betting against black, reasoning incorrectly that the streak was causing an imbalance in the randomness of the wheel, and that it had to be followed by a long streak of red.

# Black or Red

- Suppose you're on a game show, and there are three doors. Behind the



## Monte Carlo Casino

in a game of roulette at the Monte Carlo Casino on August 18, 1913, the ball fell in black 26 times in a row.

## Monte Carlo Casino

$$n = 26, p = \frac{1}{2}, k = 26$$

$$\begin{aligned} b(n, p, k) &= b\left(26, \frac{1}{2}, 26\right) = \binom{26}{26} \left(\frac{1}{2}\right)^{26} \\ &= \left(\frac{1}{2}\right)^{26} \approx 1.5 \times 10^{-8} \end{aligned}$$

An experiment has **two** possible outcomes.

!

The **same** experiment is repeated.

!

Any two experiments are independent.

!

### Binomial Distribution

$$b(n, p, k) = \binom{n}{k} p^k q^{n-k}$$



two

!

\* Suppose you're playing a game of darts, and  
you're given the choice of three darts.

same

!

independent

!

## Binomial Distribution

$$b(n, p, k) = \binom{n}{k} p^k q^{n-k}$$



# Colorful Balls in a Jar



Experiment

Blindly pick up 3 balls.

Random variable

Number of brown balls.

Distribution

Binomial distribution or not?



# TOSS A COIN

Toss a coin until first head shows up.



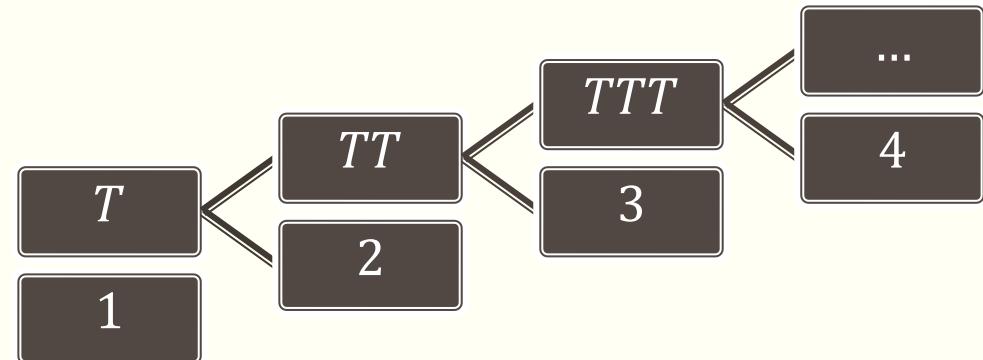
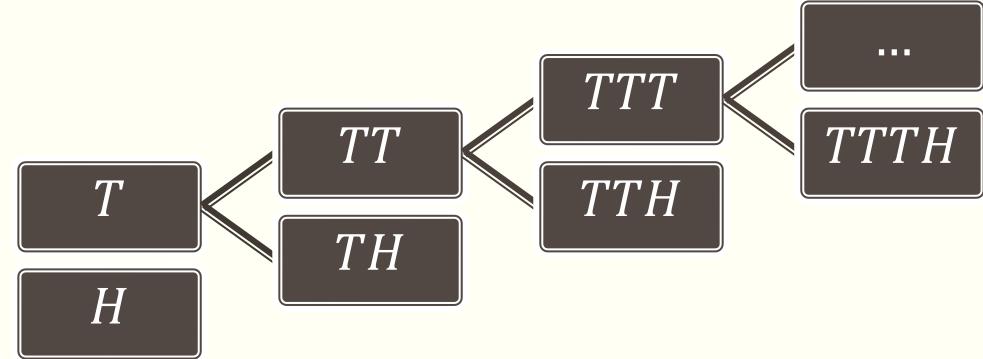
# Infinite Discrete Sample Space

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## First Head

- The experiment is to repeatedly toss a coin until first head shows up.
- Possible outcomes are sequences of  $T$  that, if finite, end with a single  $H$ , and an infinite sequence of  $T$ :
- $\Omega = \{H, TH, TTH, TTTH, TTTTH, \dots\}$
- One random variable is defined most naturally as **the length of an outcome**.
- It draws values from the set of whole numbers augmented by the symbol of infinity:
- $\{1, 2, 3, 4, 5, \dots, \infty\}$



# Geometric Distribution

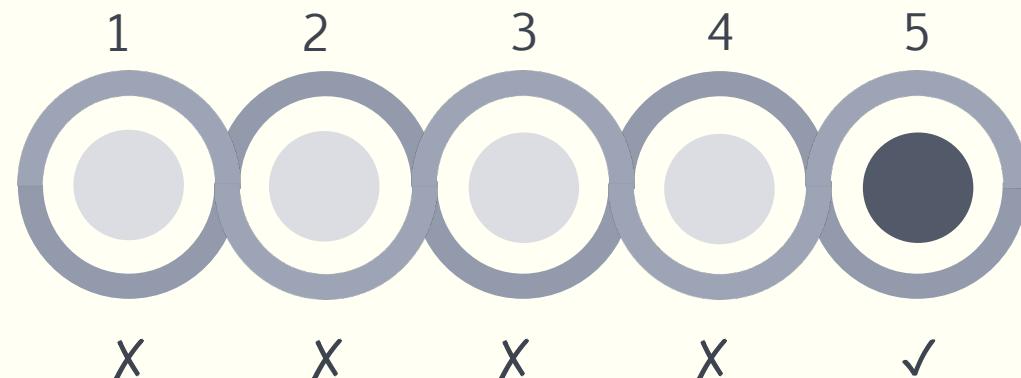
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- Consider a Bernoulli trials process continued for an infinite number of trials.
- For example, a coin tossed an infinite sequence of times.
- we can determine the distribution for any random variable  $X$  relating to the experiment provided  $P(X = a)$  can be computed in terms of a finite number of trials.
- For example, let  $T$  be the number of trials up to and including the **first success**.

Geometric Distribution

$$P(T = n) = q^{n-1}p$$



# Geometric Distribution

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Toss a coin

first head

$$\begin{aligned} P(T = n) &= q^{n-1}p = \left(\frac{1}{2}\right)^{n-1} \frac{1}{2} \\ &= \left(\frac{1}{2}\right)^n \end{aligned}$$



# Geometric Distribution

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Roll a dice

first 6

$$P(T = n) = q^{n-1}p = \left(\frac{5}{6}\right)^{n-1} \frac{1}{6}$$

Roll a dice

first even number

$$\begin{aligned} P(T = n) &= q^{n-1}p = \left(\frac{1}{2}\right)^{n-1} \frac{1}{2} \\ &= \left(\frac{1}{2}\right)^n \end{aligned}$$



## Geometric Distribution

$$P(T = n) = q^{n-1}p$$

An experiment has two possible outcomes: success and failure.

!

trial 2

trial 1

The same experiment is repeated until the first success.

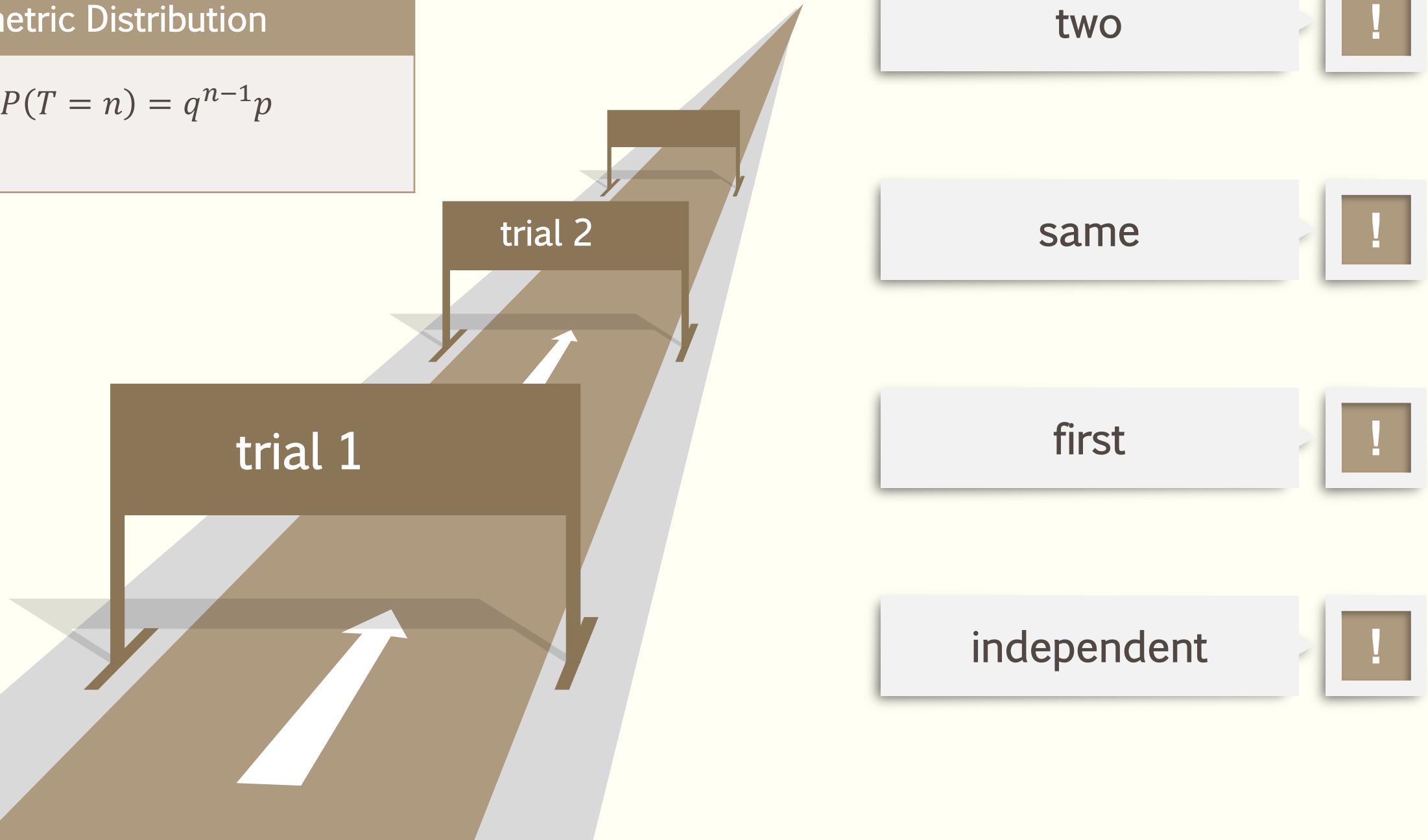
!

Any two experiments are independent.

!

## Geometric Distribution

$$P(T = n) = q^{n-1}p$$



# Colorful Balls in a Jar



## Experiment

Blindly pick up balls until get a brown one.

## Random variable

Number of balls.

## Distribution

Geometric distribution or not?

# Geometric Distribution

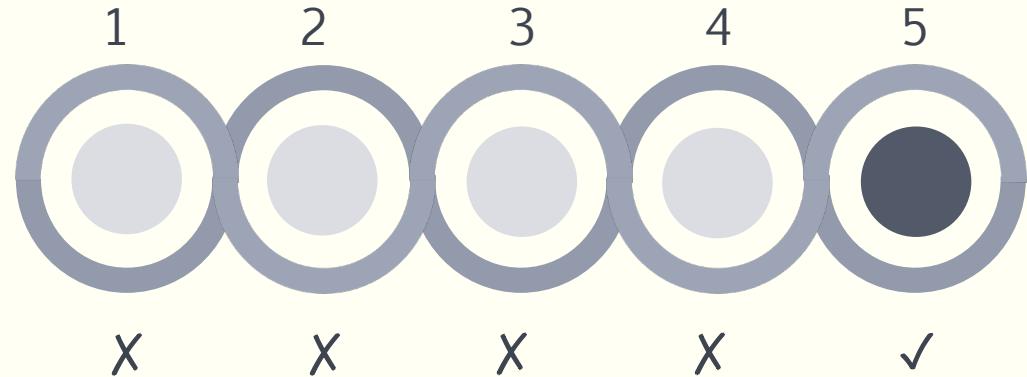
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- Consider a Bernoulli trials process continued for an infinite number of trials.
- Let  $T$  be the number of trials up to and including the **first success**.

## Geometric Distribution

$$P(T = n) = q^{n-1}p$$



## Geometric Distribution

$$P(T > k) = \sum_{j=k+1}^{+\infty} q^{j-1}p = q^k p(1 + q + q^2 + \dots) = q^k$$

what are other  
words for  
memoryless?

oblivious, unmindful, forgetful,  
forgetting,  
with a mind like a sieve,  
unremembering

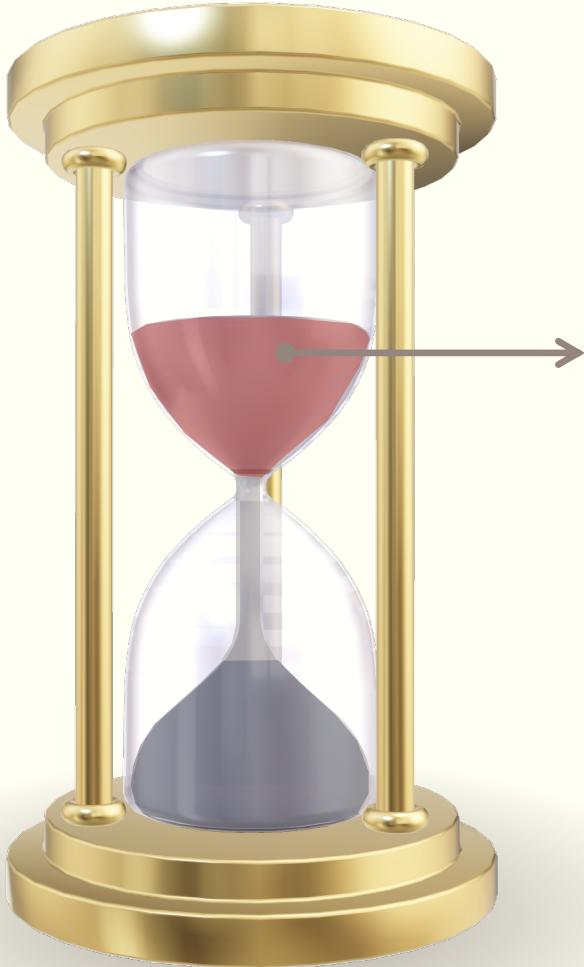


Thesaurus.plus

What is the formula for **memoryless** in probability theory?

?

# Exponential Distribution

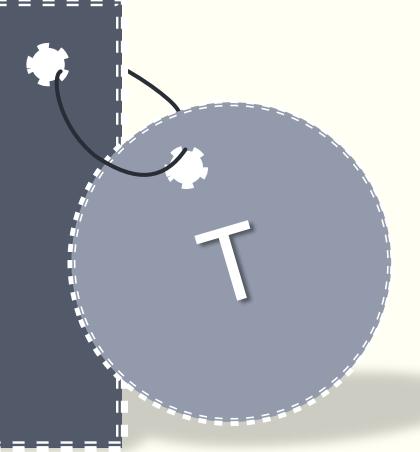


Time

- The amount of time we have to wait for an occurrence does not depend on how long we have already waited.
- The memoryless property says that knowledge of what has occurred in the past has no effect on future probabilities.

Memoryless Property

$$P(X > r + s | X > r) = P(X > s)$$



# Geometric Distribution



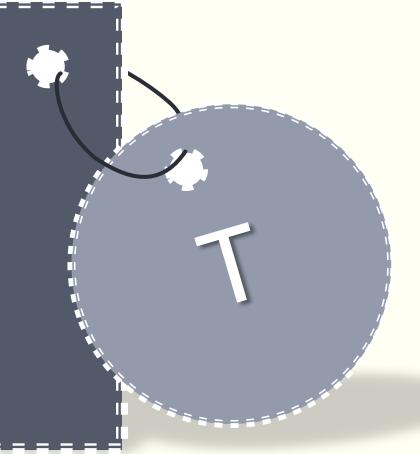
## Geometric Distribution

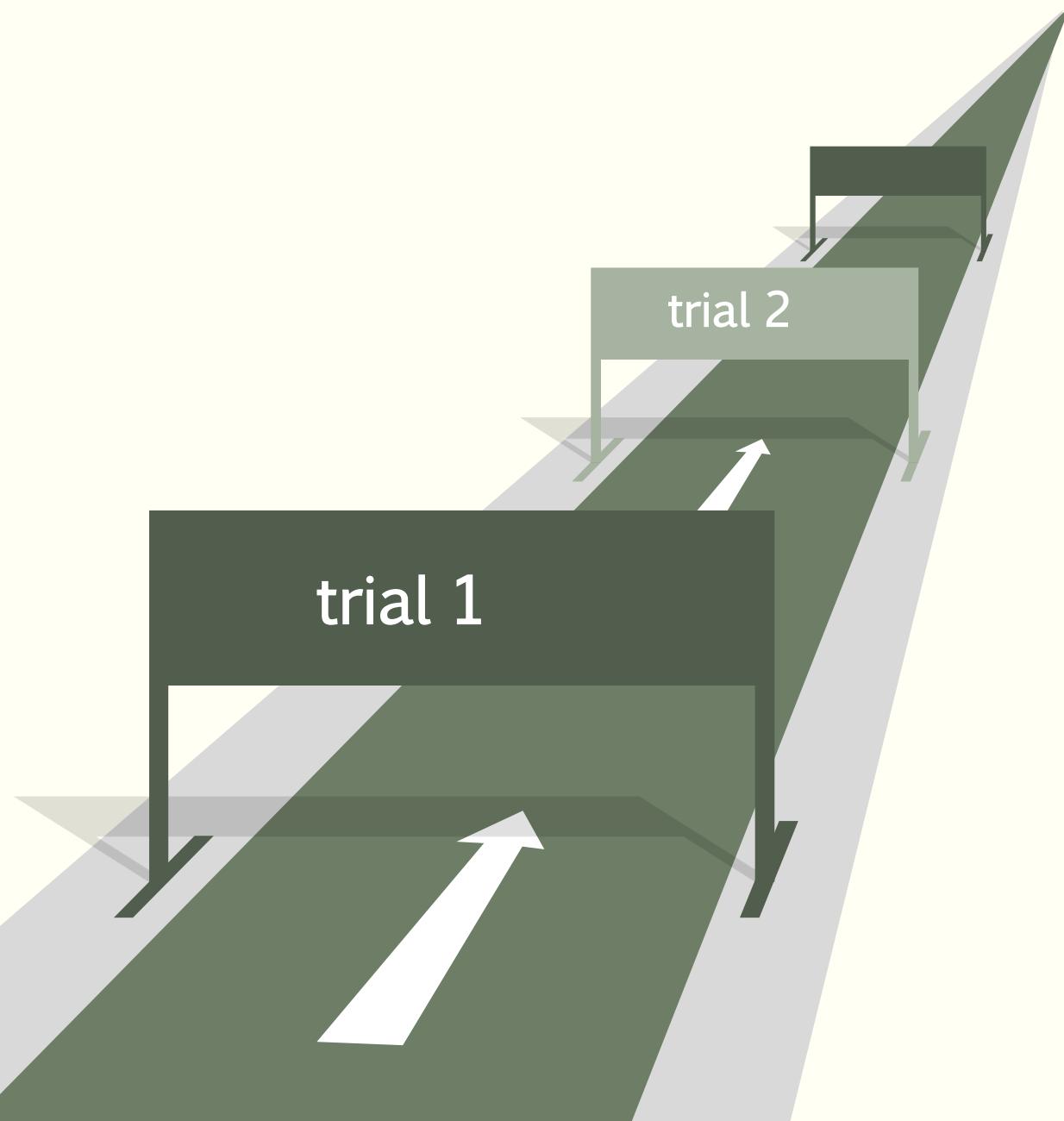
$$P(T > k) = \sum_{j=k+1}^{+\infty} q^{j-1} p = q^k p(1 + q + q^2 + \dots) = q^k$$

$$P(T > r + s | T > r) = \frac{P(T > r + s)}{P(T > r)} = \frac{q^{r+s}}{q^r} = q^s = P(T > s)$$

## Memoryless Property

$$P(T > r + s | T > r) = P(T > s)$$





two

!

same

!

$k$ th

!

independent

!

# Negative Binomial Distribution

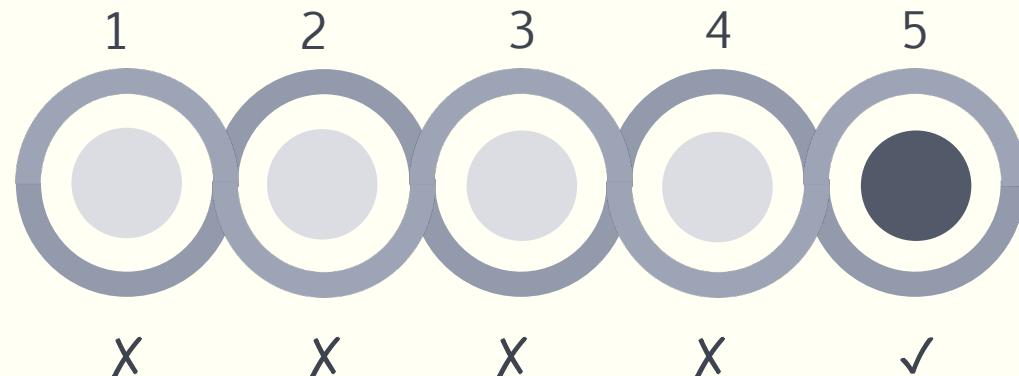
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- Suppose we are given a coin which has probability  $p$  of coming up heads when it is tossed.
- We fix a positive integer  $k$ , and toss the coin until the  $k$ th head appears.
- We let  $X$  represent the number of tosses.
- When  $k = 1$ ,  $X$  is ...

## Geometric Distribution

$$P(T = n) = q^{n-1}p$$

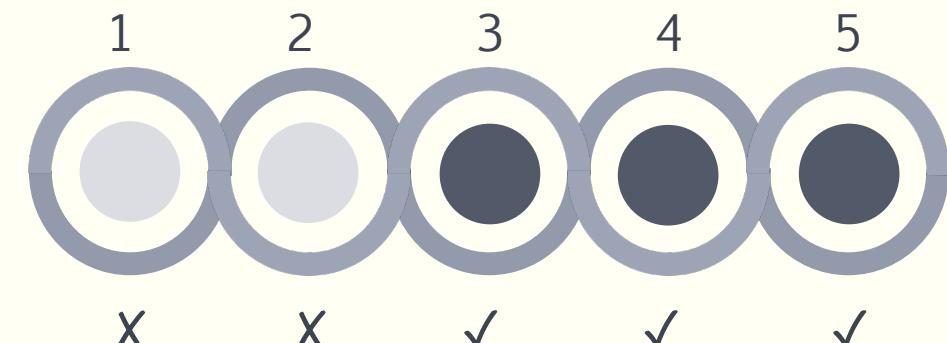
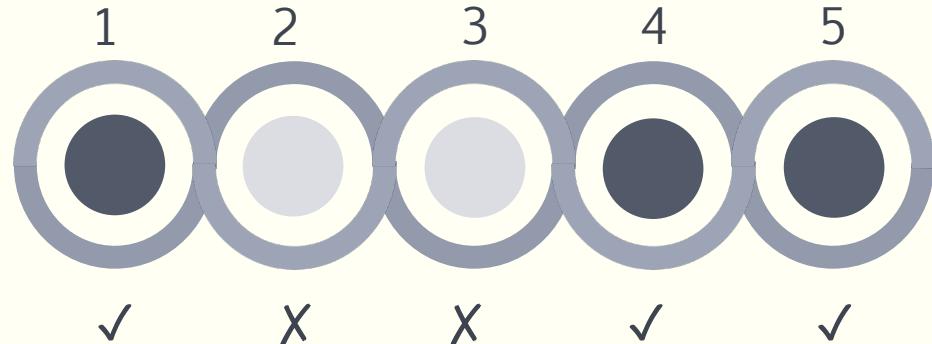
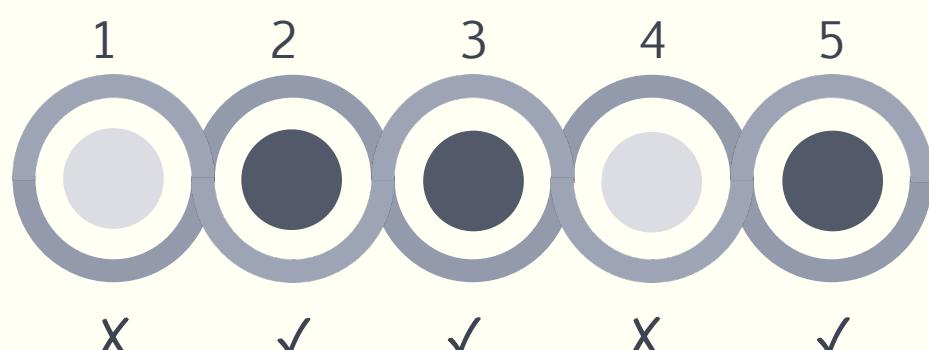
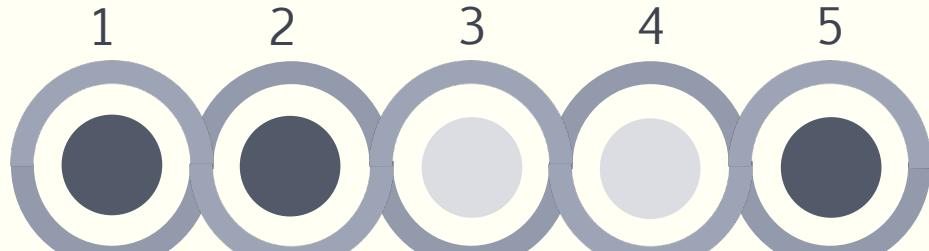


We let  $X$  represent the number of tosses.  
For a general  $k$ , we now calculate the probability distribution of  $X$ .

?

## Negative Binomial Distribution

- number of heads:  $k = 3$
- number of tosses:  $x = 5$
- distribution:  $u(x, k, p)$

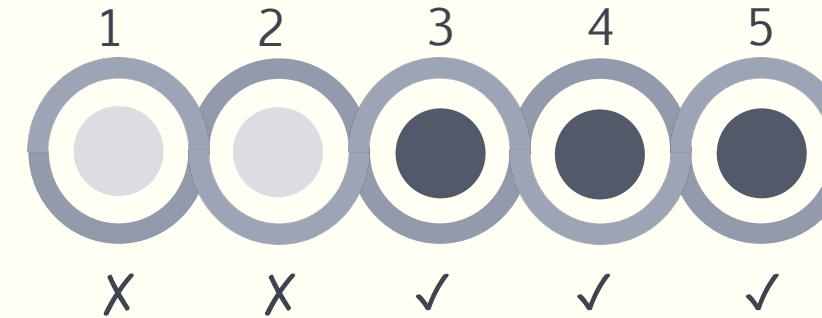
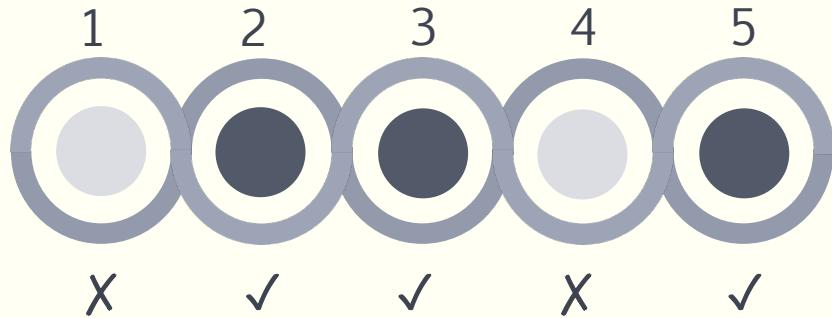
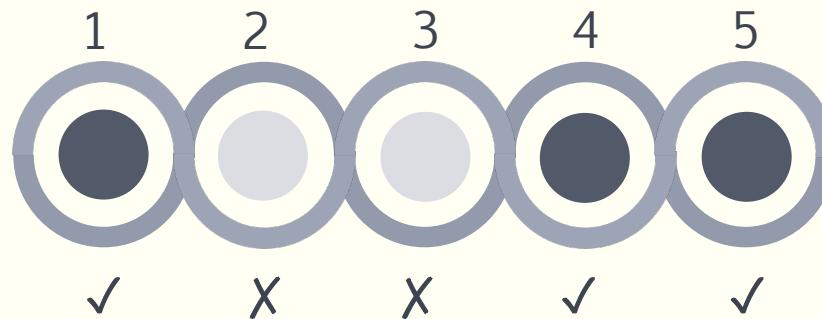
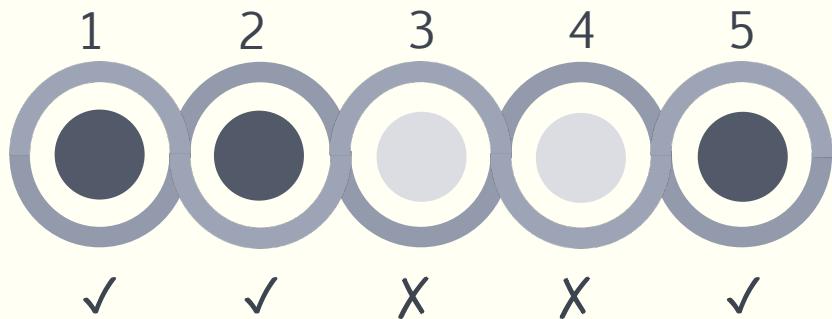


# Negative Binomial Distribution

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- If  $X = x$ , then it must be true that there were exactly  $k - 1$  heads thrown in the first  $x - 1$  tosses, and a head must have been thrown on the  $x$ th toss.



## Negative Binomial Distribution

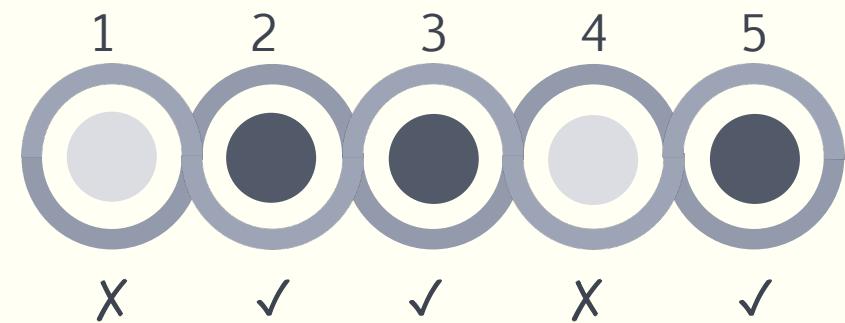
- number of heads:  $k$
- number of tosses:  $x$
- distribution:  $u(x, k, p)$

There are

$$\binom{x-1}{k-1}$$

sequences of length  $x$  with these properties, and each of them is assigned the same probability, namely

$$p^k q^{x-k}.$$



## Negative Binomial Distribution

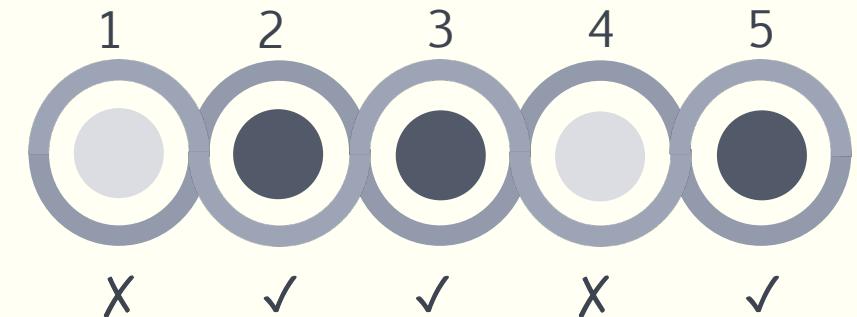
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There are

$$\binom{x-1}{k-1}$$

sequences of length  $x$  with these properties, and each of them is assigned the same probability, namely

$$p^k q^{x-k}.$$



## Negative Binomial Distribution

$$u(x, k, p) = \binom{x-1}{k-1} p^k q^{x-k}$$

# Negative Binomial Distribution

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Roll a dice

until the 6<sup>th</sup> 6

- probability of success:  $p = \frac{1}{6}$
- number of successes:  $k = 6$
- number of trials:  $x$
- distribution:  $u(x, k, p)$

$$u(x, k, p) = \binom{x-1}{k-1} p^k q^{x-k}$$

$$= \binom{x-1}{5} \left(\frac{1}{6}\right)^6 \left(\frac{5}{6}\right)^{x-6}$$



# Negative Binomial Distribution

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Roll a dice

until the 2<sup>nd</sup> even number

- probability of success:  $p = \frac{1}{2}$
- number of successes:  $k = 2$
- number of trials:  $x$
- distribution:  $u(x, k, p)$

$$u(x, k, p) = \binom{x-1}{k-1} p^k q^{x-k}$$

$$= \binom{x-1}{1} \left(\frac{1}{2}\right)^2 \left(\frac{1}{2}\right)^{x-2} = \frac{x-1}{2^x}$$



# Colorful Balls in a Jar



## Experiment

Blindly pick up balls until get the 3<sup>rd</sup> brown one.

## Random variable

Number of balls.

## Distribution

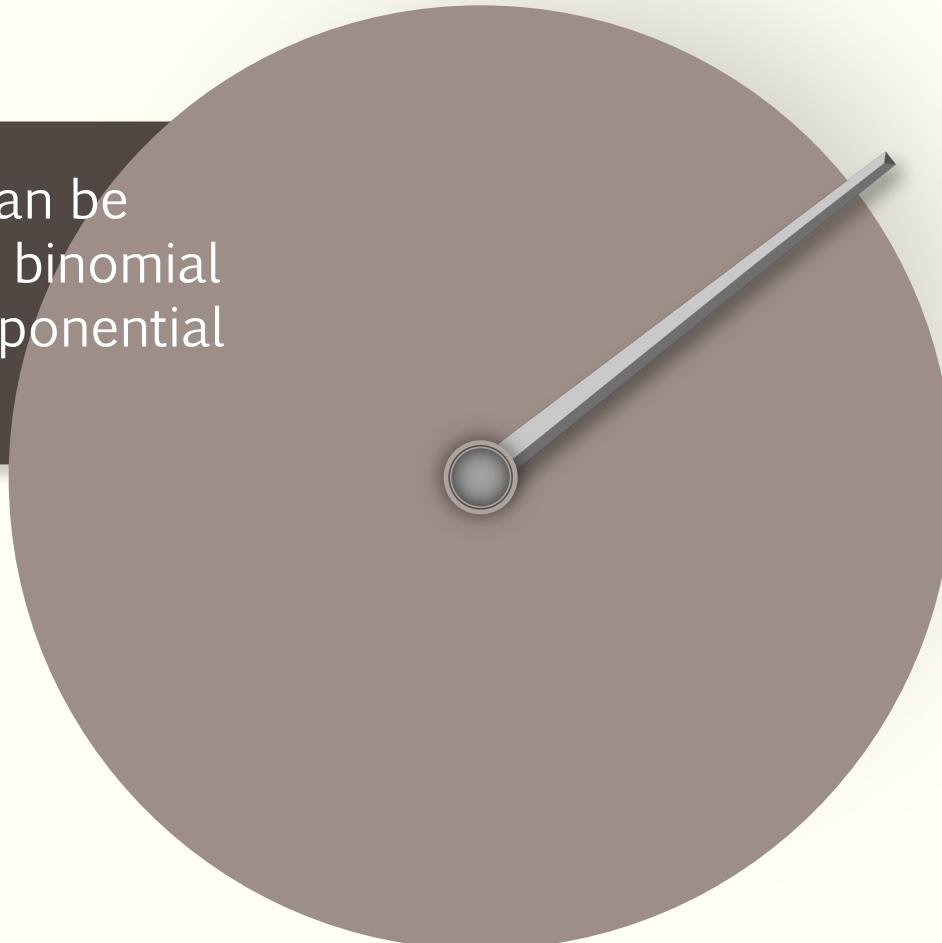
Negative binomial distribution or not?

# When it comes to time...

## Binomial distribution

$$b(n, p, k) = \binom{n}{k} p^k q^{n-k}$$

The Poisson distribution can be viewed as arising from the binomial distribution or from the exponential density.



## Poisson Distribution

$$P(X = k) = \frac{\lambda^k}{k!} e^{-\lambda}$$

## Exponential Distribution

$$f(x) = \begin{cases} \lambda e^{-\lambda x}, & x \geq 0 \\ 0, & x < 0 \end{cases}$$

# Number of occurrences



## Number of telephone calls

- Suppose that we have a situation in which a certain kind of occurrence happens at random over a period of time.
- For example, the occurrences that we are interested in might be **incoming telephone calls** to a police station in a large city.
- We want to model this situation so that we can consider the probabilities of events such as more than 3 phone calls occurring in a 12-hour time interval.

# Number of occurrences



## Number of telephone calls

- We want to model this situation so that we can consider the probabilities of events such as more than 3 phone calls occurring in a 12-hour time interval.
- we assume that the **average rate**, i.e., the average number of occurrences per hour, is a constant. This rate we will denote by  $\lambda$ .
- On the average, there are  $\lambda t$  occurrences in a time interval of length  $t$ .

# Number of occurrences

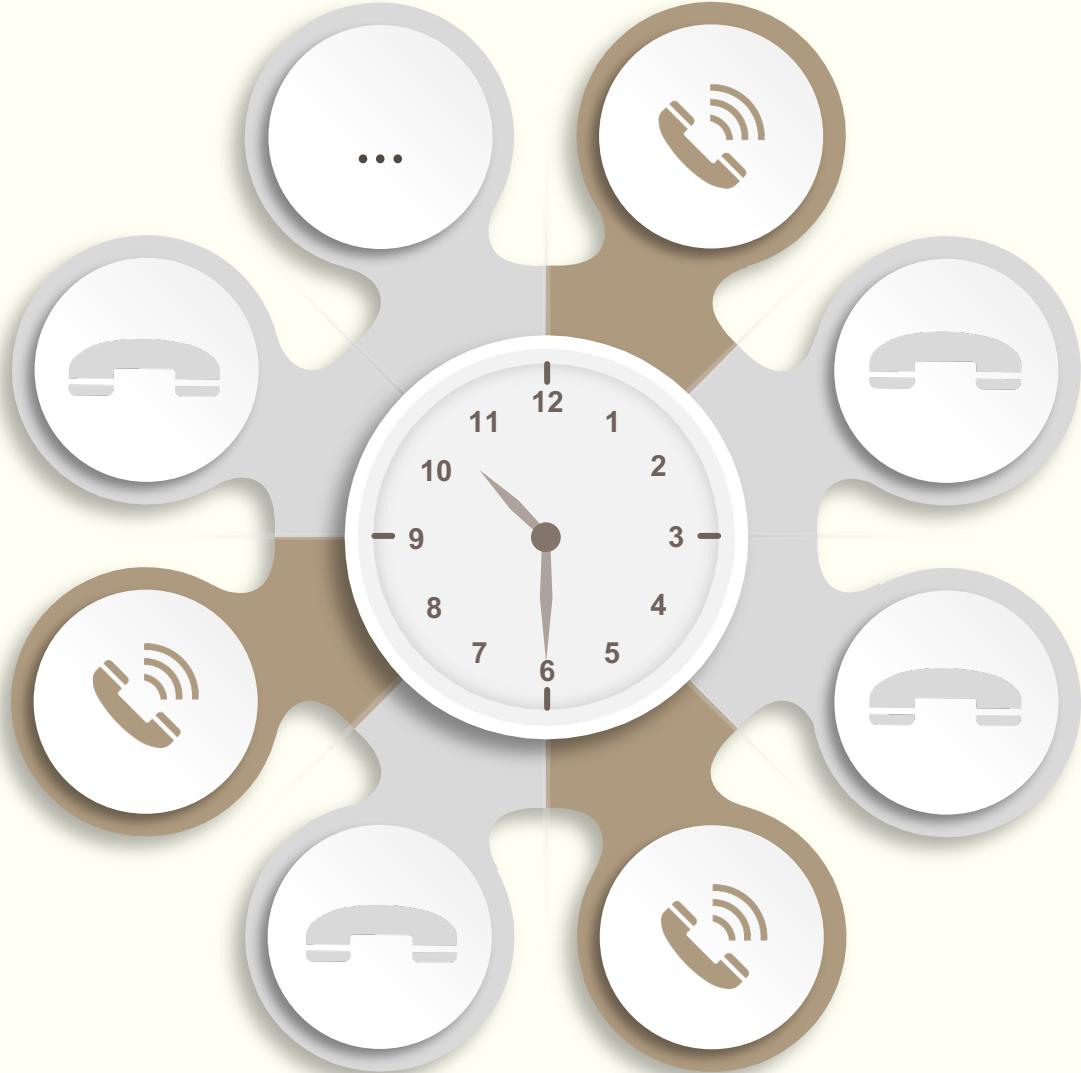


## Number of telephone calls

- average rate:  $\lambda$
- time:  $t$

$$k = \lambda t$$

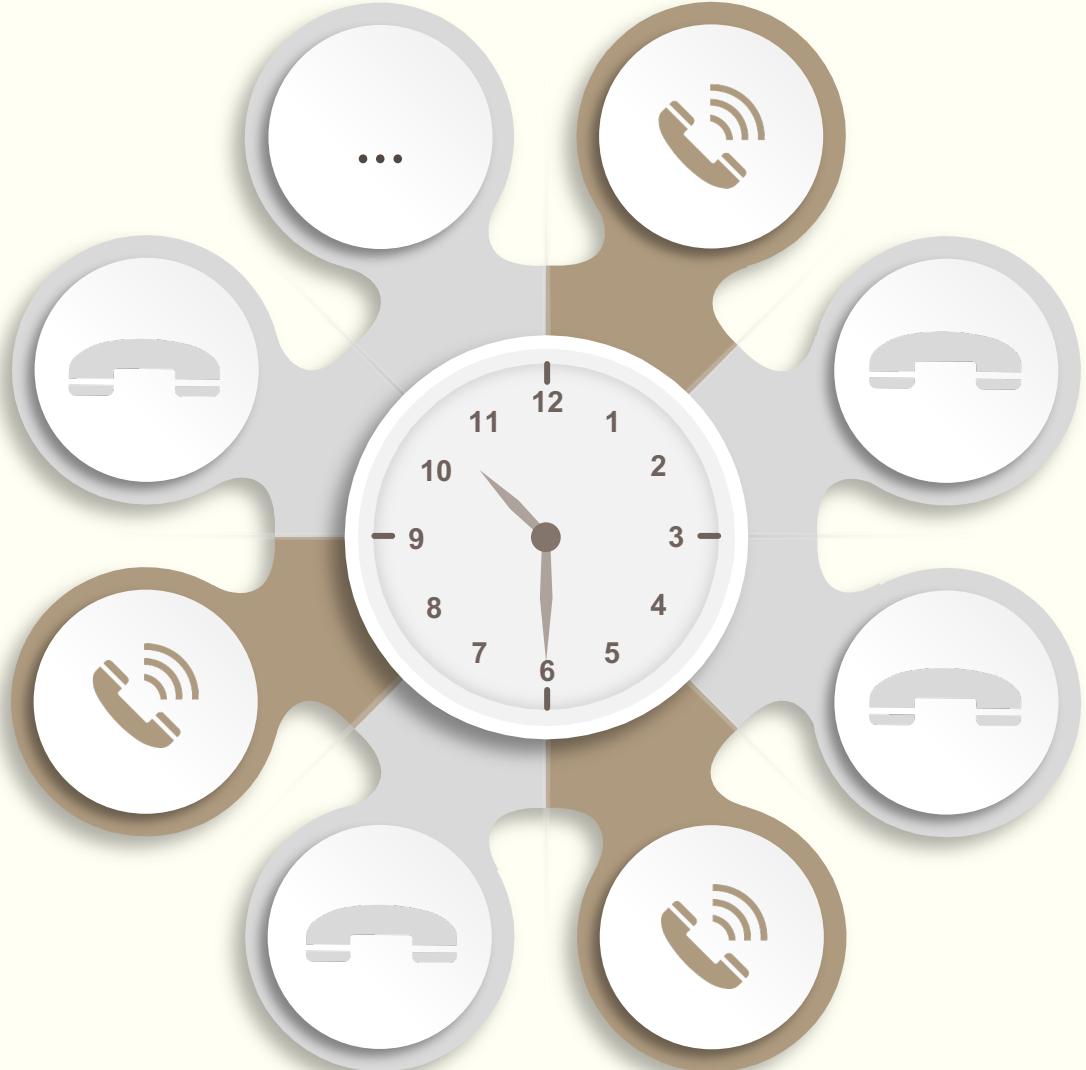
# Bernoulli trials



## Binomial distribution

- We can use the binomial distribution to model this situation.
- We imagine that a given time interval is broken up into  $n$  subintervals of equal length.
- If the subintervals are sufficiently short, we can assume that two or more occurrences happen in one subinterval with a probability which is negligible in comparison with the probability of at most one occurrence.
- Thus, in each subinterval, we are assuming that there is either 0 or 1 occurrence.

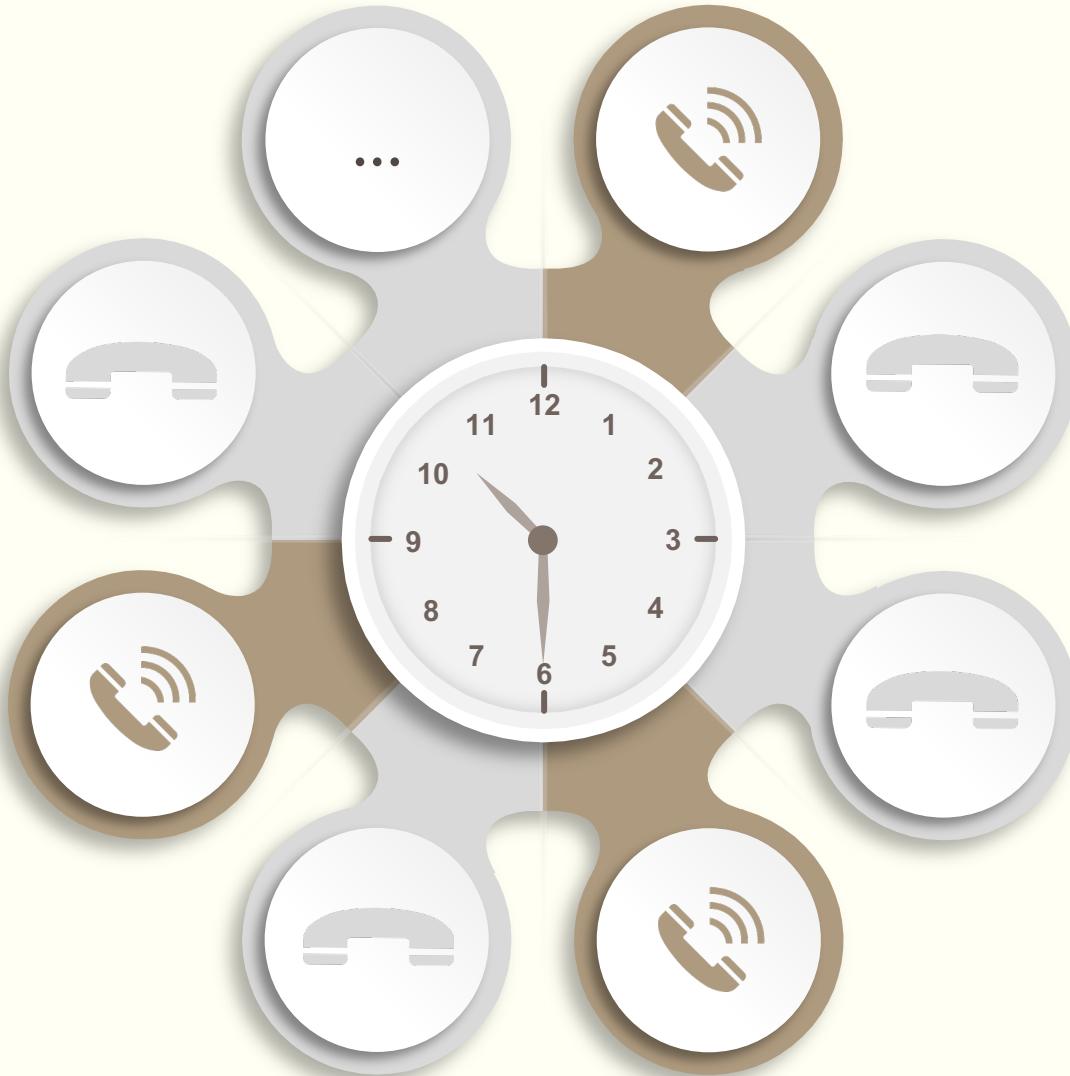
# Bernoulli trials



## Binomial distribution

- The sequence of subintervals can be thought of as a sequence of Bernoulli trials, with a success corresponding to an occurrence in the subinterval.
- If this time interval is divided into  $n$  subintervals, then we would expect, using the Bernoulli trials interpretation, that there should be  $np$  occurrences.

# Bernoulli trials



## Number of telephone calls

- probability of success:  $p$
- number of trials:  $n$

$$k = np$$

# Number of occurrences



## Number of telephone calls

- average rate:  $\lambda$
- time:  $t$

$$k = \lambda t$$

## Number of telephone calls

- probability of success:  $p$
- number of trials:  $n$

$$k = np$$

$$np = \lambda t$$

$$p = \frac{\lambda t}{n}$$

=

=

# Number of occurrences



## Binomial Distribution

$$b(n, p, k) = \binom{n}{k} p^k q^{n-k}$$

$$P(X = 0) = b(n, p, 0) = (1 - p)^n$$

$$\frac{P(X = k)}{P(X = k - 1)} = \frac{b(n, p, k)}{b(n, p, k - 1)} = \frac{\binom{n}{k} p^k q^{n-k}}{\binom{n}{k-1} p^{k-1} q^{n-k+1}} = \frac{(n - k + 1)p}{kq}$$

# Number of occurrences



$$p = \frac{\lambda t}{n}, \quad t = 1, \quad n \rightarrow \infty$$

=

## Binomial Distribution

$$b(n, p, k) = \binom{n}{k} p^k q^{n-k}$$

$$P(X = 0) = (1 - p)^n = \left(1 - \frac{\lambda}{n}\right)^n$$

$$\frac{P(X = k)}{P(X = k - 1)} = \frac{(n - k + 1)p}{kq} = \frac{\lambda - (k - 1)p}{kq}$$

# Number of occurrences

$$p = \frac{\lambda t}{n}, t = 1, n \rightarrow \infty, p \rightarrow 0$$

=

## Binomial Distribution

$$b(n, p, k) = \binom{n}{k} p^k q^{n-k}$$

$$P(X = 0) = (1 - p)^n = (1 - \frac{\lambda}{n})^n \approx e^{-\lambda}$$

$$\frac{P(X = k)}{P(X = k - 1)} = \frac{(n - k + 1)p}{kq} = \frac{\lambda - (k - 1)p}{kq} \approx \frac{\lambda}{k}$$

$$P(X = 1) \approx \lambda e^{-\lambda}$$

$$P(X = 2) \approx \frac{\lambda^2}{2!} e^{-\lambda}$$



# Number of occurrences



$$p = \frac{\lambda t}{n}, t = 1, n \rightarrow \infty, p \rightarrow 0$$

=

## Poisson Distribution

$$P(X = 0) = e^{-\lambda}$$

$$\frac{P(X = k)}{P(X = k - 1)} = \frac{\lambda}{k}$$

$$P(X = k) = \frac{\lambda^k}{k!} e^{-\lambda}$$

# Poisson Distribution



$$P(X = k) = \frac{\lambda^k}{k!} e^{-\lambda}$$

0

$$e^{-\lambda}$$

- no
- at least one
- ....

$$e^{-\lambda}$$

1

$$\lambda e^{-\lambda}$$

- one
- less than two
- at least two
- ...

$$(\lambda + 1)e^{-\lambda}$$

2

$$\frac{\lambda^2}{2} e^{-\lambda}$$

- two
- less than three
- at least three
- ...

$$(\frac{\lambda^2}{2} + \lambda + 1)e^{-\lambda}$$

# Binomial Distribution and Poisson Distribution

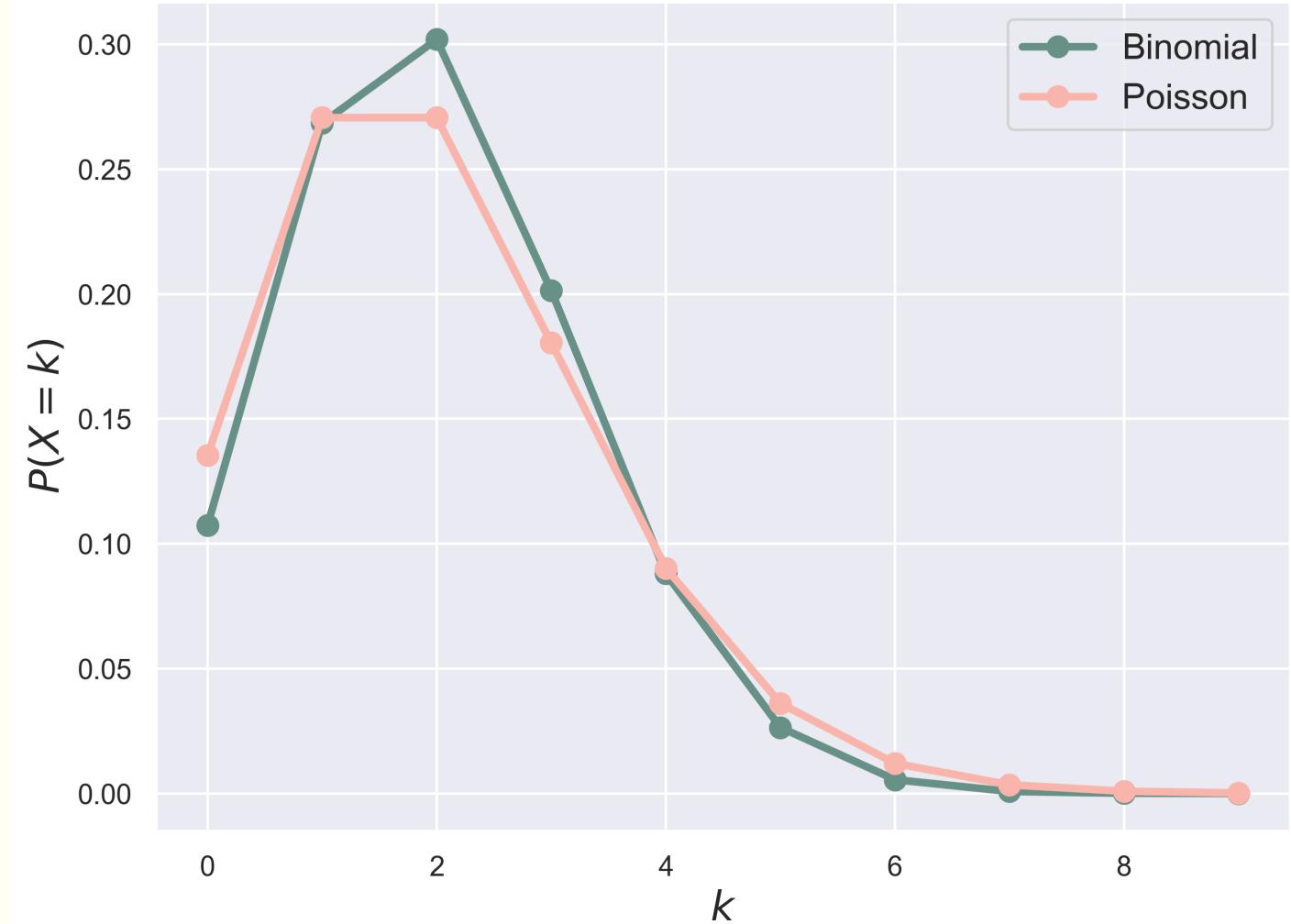
## Binomial Distribution

$$b(n, p, k) = \binom{n}{k} p^k q^{n-k}$$

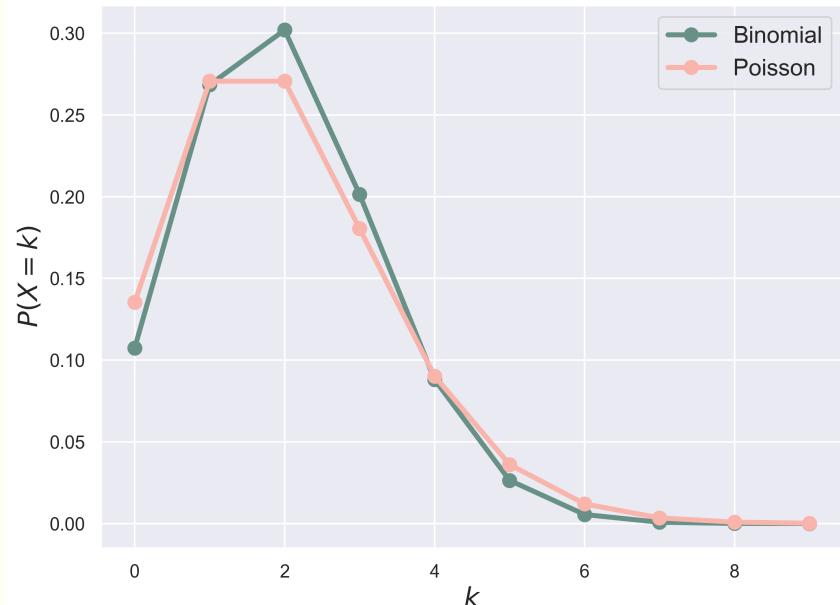
## Poisson Distribution

$$P(X = k) = \frac{\lambda^k}{k!} e^{-\lambda}$$

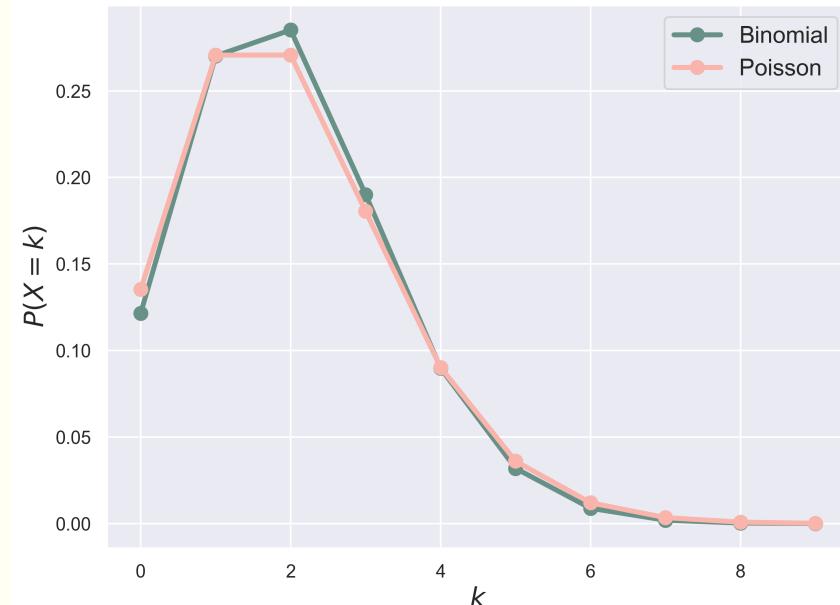
$n = 10, p = 0.2, \lambda = 2.0$



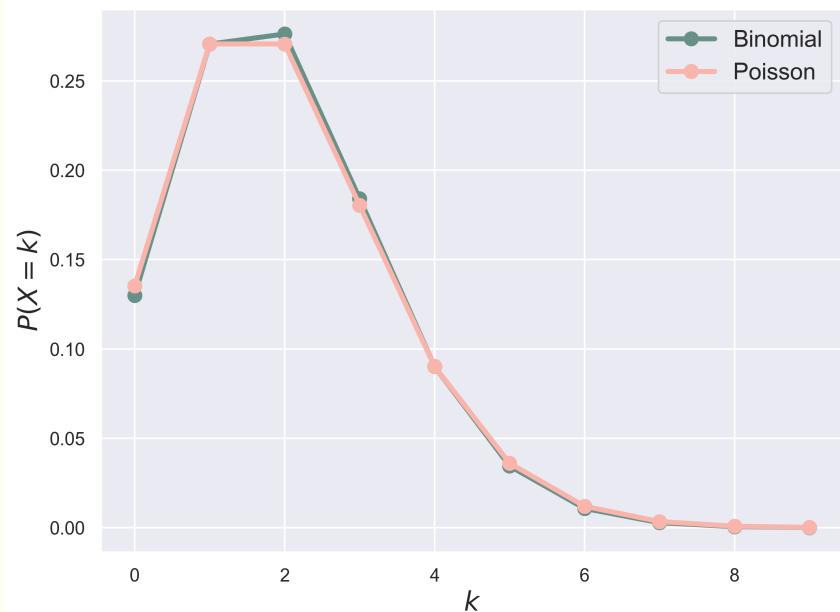
$n = 10, p = 0.2, \lambda = 2.0$



$n = 20, p = 0.1, \lambda = 2.0$



$n = 50, p = 0.04, \lambda = 2.0$



$$p = \frac{\lambda t}{n}, t = 1, n \rightarrow \infty, p \rightarrow 0$$

=

# Which one to use?

Binomial distribution

$$b(n, p, k) = \binom{n}{k} p^k q^{n-k}$$

two parameters

!

$n$

$p$

Poisson Distribution

$$P(X = k) = \frac{\lambda^k}{k!} e^{-\lambda}$$

one parameter

!

$\lambda$

# Example



## Real Estate

- The average number of homes sold by the Acme Realty company is 2 homes per day. What is the probability that exactly 3 homes will be sold tomorrow?

# Example



## Poisson Distribution

$$P(X = k) = \frac{\lambda^k}{k!} e^{-\lambda}$$

- 2 homes per day:  $\lambda = 2$
- 3 homes:  $k = 3$

$$P(X = 3) = \frac{2^3}{3!} e^{-2} = \frac{4}{3e^2}$$

# Which one to use?

Binomial distribution

$$b(n, p, k) = \binom{n}{k} p^k q^{n-k}$$

$n < +\infty$

!

Poisson Distribution

$$P(X = k) = \frac{\lambda^k}{k!} e^{-\lambda}$$

$n \rightarrow +\infty$

!

# Which one to use?

Binomial distribution

$$b(n, p, k) = \binom{n}{k} p^k q^{n-k}$$

$n = 2, 5, \dots$

!

Poisson Distribution

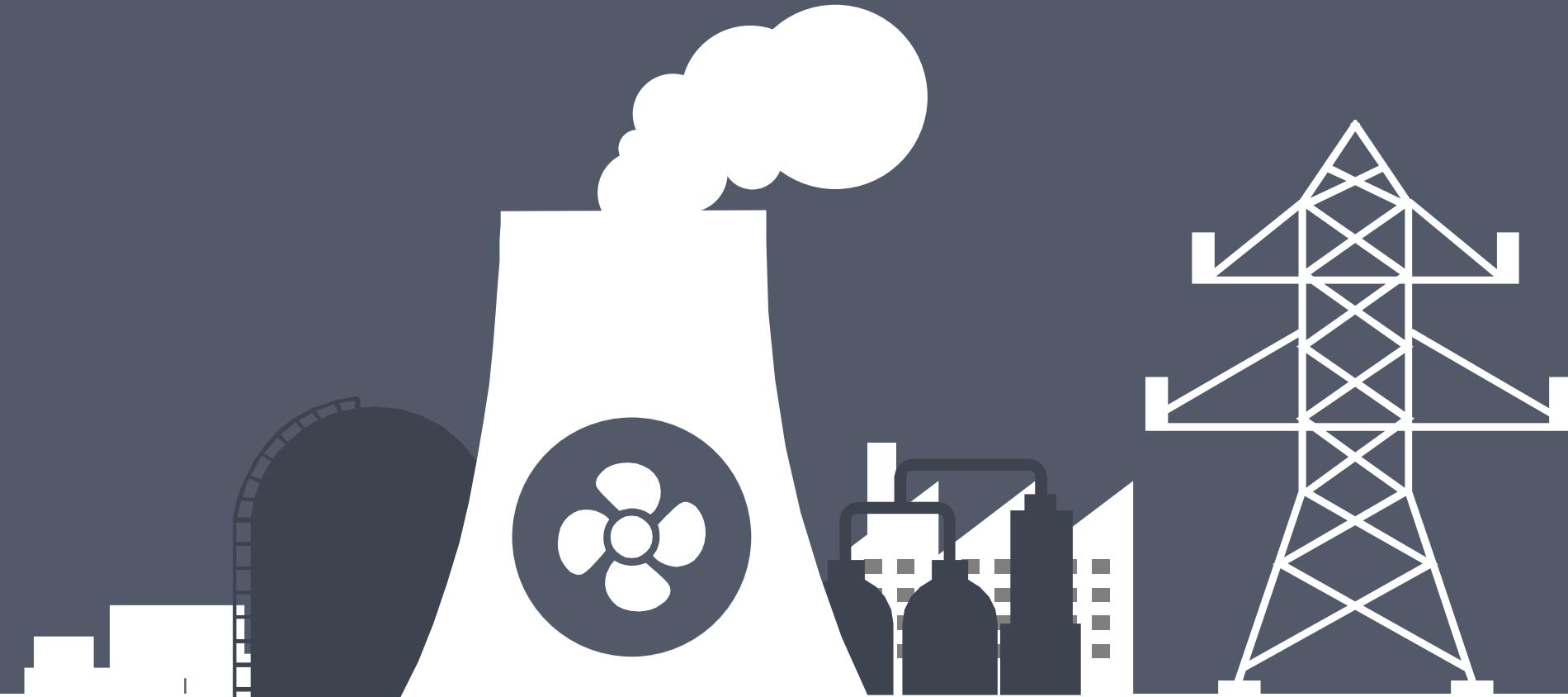
$$P(X = k) = \frac{\lambda^k}{k!} e^{-\lambda}$$

$n = 50, 100, \dots$

!

$$np = \lambda$$

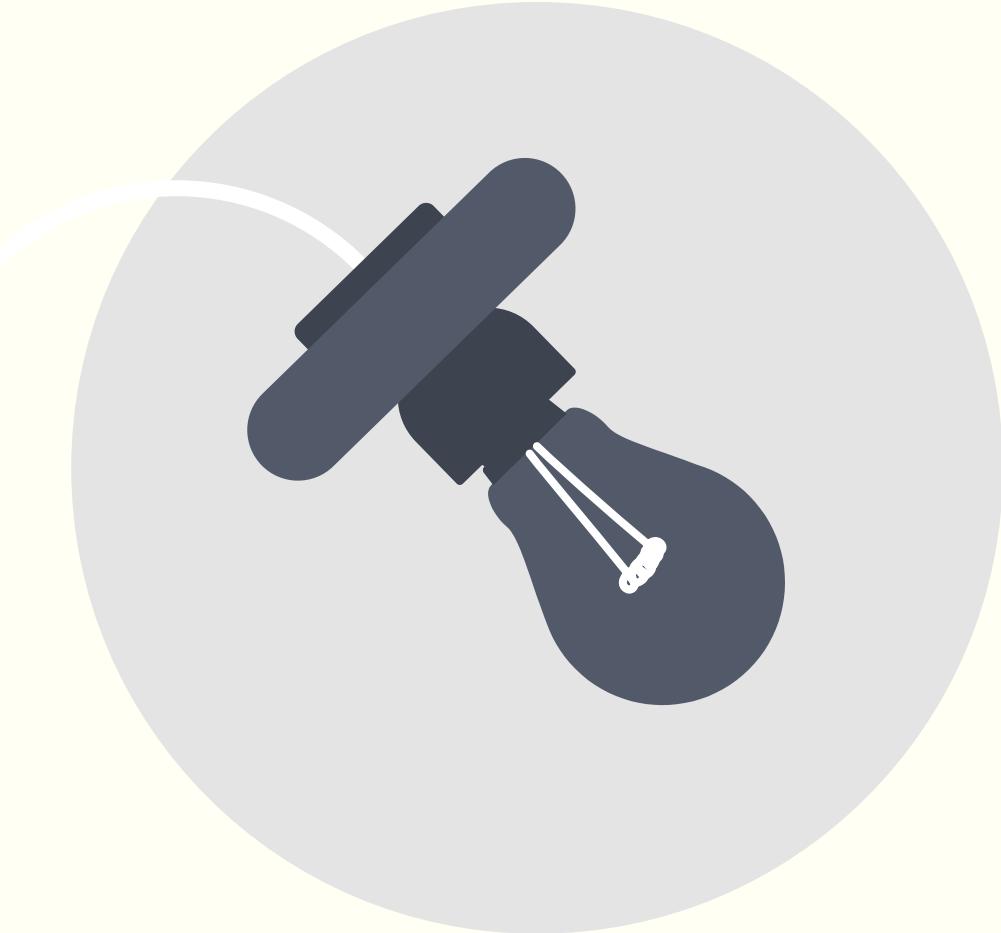
=



## Nuclear Power Plant

Assume that the probability that there is a significant accident in a nuclear power plant during one year's time is .001. If a country has 100 nuclear plants, estimate the probability that there is at least one such accident during a given year.

# Nuclear Power Plant



## Parameters (binomial)

- number of power plants  $n: 100$
- probability of an accident  $p: 0.001$

## Parameter (Poisson)

$$\lambda = np = 100 \times 0.001 = 0.1$$

# Nuclear Power Plant



Event

at least one such accident during a given year

Random variable

number of accidents

Probability

$$P(X \geq 1) = 1 - P(X = 0)$$

# Nuclear Power Plant



## Parameters (binomial)

- number of power plants  $n: 100$
- probability of an accident  $p: 0.001$
- $b(n, p, k) = \binom{n}{k} p^k q^{n-k}$

## Parameter (Poisson)

- $\lambda = np = 100 \times 0.001 = 0.1$
- $P(X = k) = \frac{\lambda^k}{k!} e^{-\lambda}$

## Probability

$$\begin{aligned} P(X \geq 1) &= 1 - P(X = 0) \\ &= 1 - e^{-0.1} \end{aligned}$$

# More than just time!

## Binomial distribution

$$b(n, p, k) = \binom{n}{k} p^k q^{n-k}$$

$n = 2, 5, \dots$



## Poisson Distribution

$$P(X = k) = \frac{\lambda^k}{k!} e^{-\lambda}$$

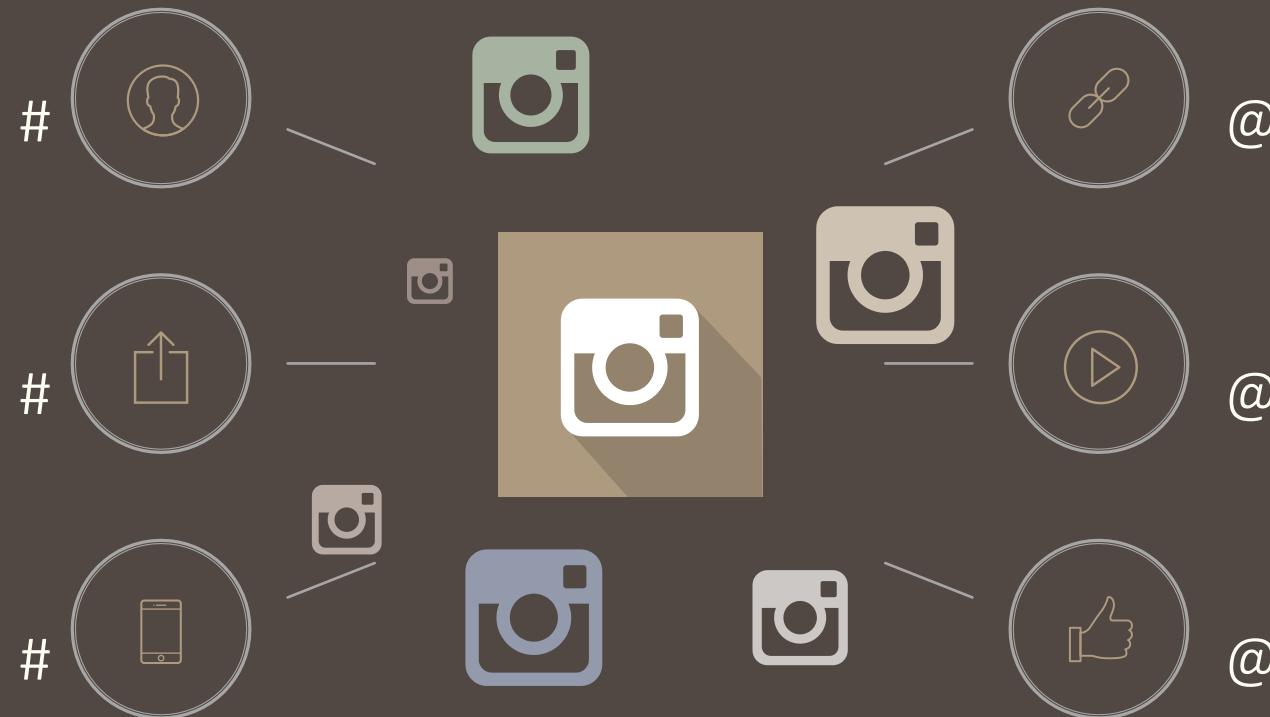
$n = 50, 100, \dots$



$np = \lambda$

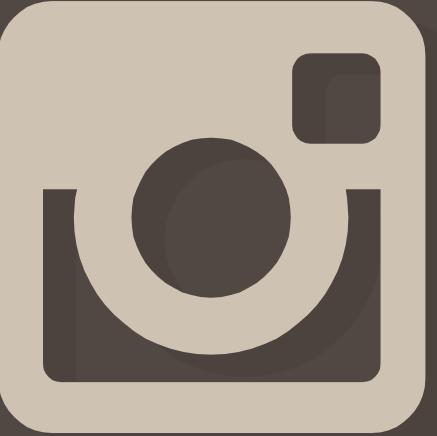


# Instagram Ads



An advertiser drops 10,000 videos on Instagram under 2000 hashtags. Assume that each video has an equal chance of landing on each hashtag. What is the probability that a particular hashtag will receive no videos?

# Instagram Ads



instagram

10,000 videos on Instagram  
under 2000 hashtags

## Parameters (binomial)

- number of videos  $n$ : 10000
- number of hashtags  $\frac{1}{p}$ : 2000

## Parameter (Poisson)

$$\lambda = np = 10000 \times \frac{1}{2000} = 5$$

# Instagram Ads



instagram

a particular hashtag will  
receive no videos

Event

a particular hashtag will receive no  
videos

Random variable

number of videos the hashtag will  
receive

Probability

$$P(X = 0)$$

# Instagram Ads



instagram

## Parameters (binomial)

- number of videos  $n: 10000$
- number of hashtags  $\frac{1}{p}: 2000$

## Parameter (Poisson)

$$\lambda = np = 10000 \times \frac{1}{2000} = 5$$

## Probability

$$P(X = 0) = e^{-5} \approx .00674$$

# Colorful Balls in a Jar



## Experiment

Blindly pick up 5 balls  
(without replacement).

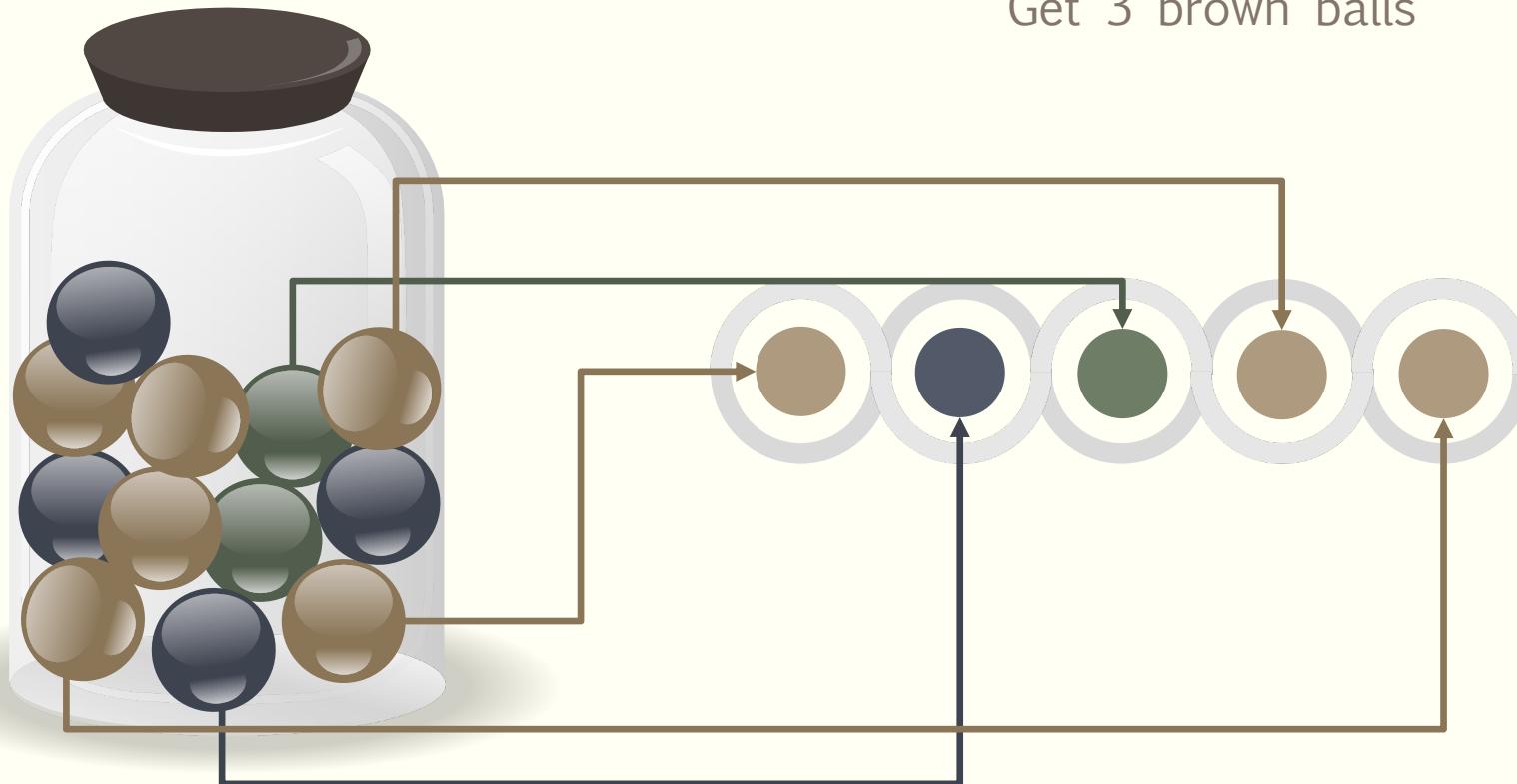
## Random variable

Number of brown balls.

## Distribution

Hypergeometric  
distribution.

# Colorful Balls in a Jar



## Experiment

Blindly pick up 5 balls (without replacement).

## Event

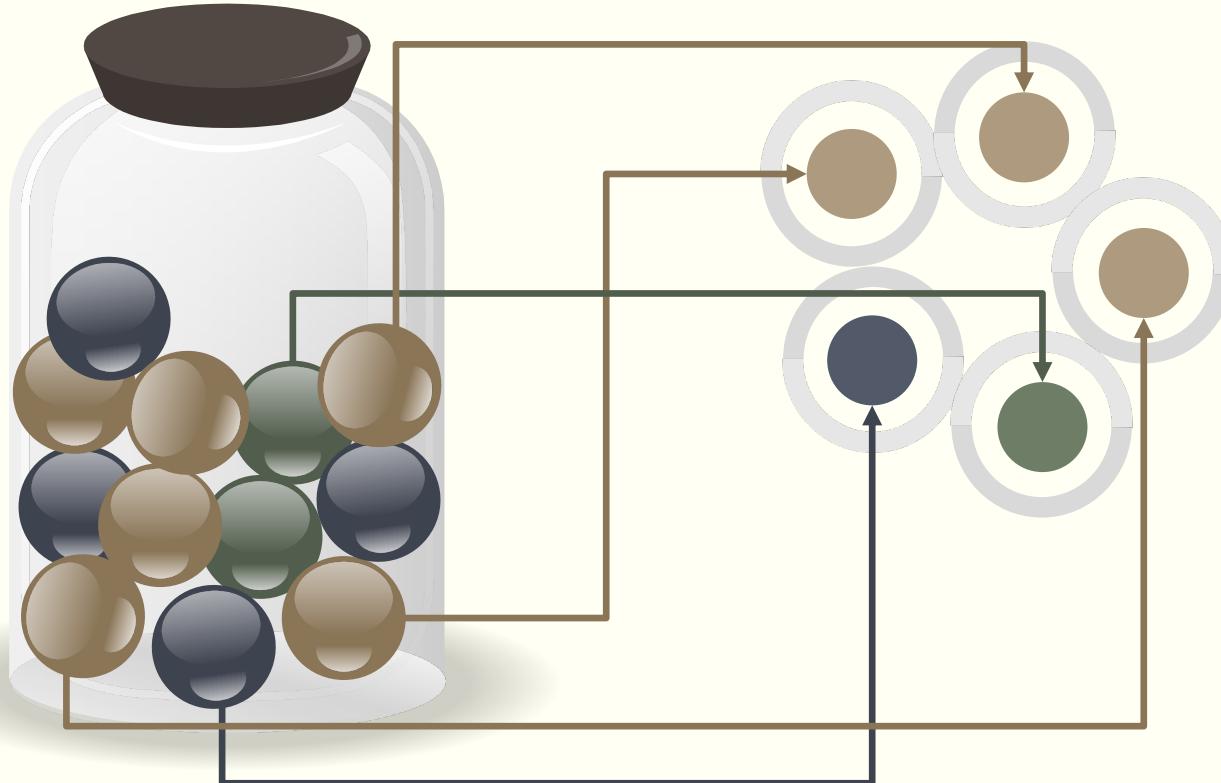
Get 3 brown balls

$N$  choose  $n$  samples

$$N = 12, n = 5$$

$$\binom{N}{n} = \binom{12}{5}$$

# Colorful Balls in a Jar



Random variable

Number of brown balls.

$N$  choose  $n$  samples

$$N = 12, n = 5$$

$$\binom{N}{n} = \binom{12}{5}$$

$k$  choose  $x$

$$k = 6, x = 3$$

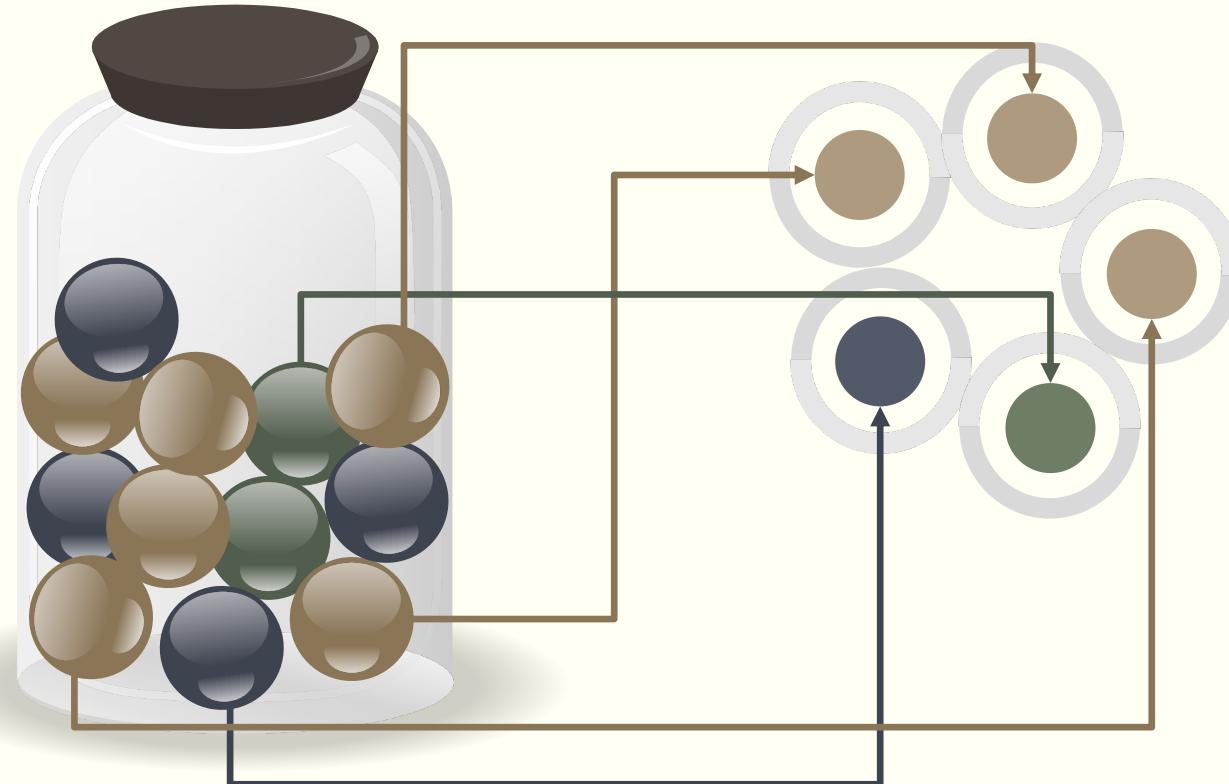
$$\binom{k}{x} = \binom{6}{3}$$

$N - k$  choose  $n - x$

$$N - k = 6, n - x = 2$$

$$\binom{N - k}{n - x} = \binom{6}{2}$$

# Colorful Balls in a Jar



$N$  choose  $n$  samples

$$N = 12, n = 5$$

$$\binom{N}{n} = \binom{12}{5}$$

$k$  choose  $x$

$$k = 6, x = 3$$

$$\binom{k}{x} = \binom{6}{3}$$

$N - k$  choose  $n - x$

$$N - k = 6, n - x = 2$$

$$\binom{N - k}{n - x} = \binom{6}{2}$$

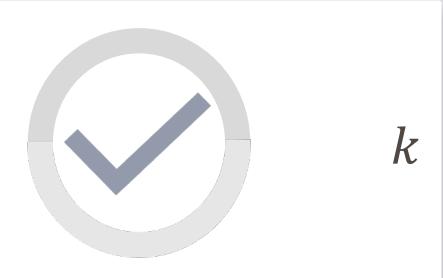
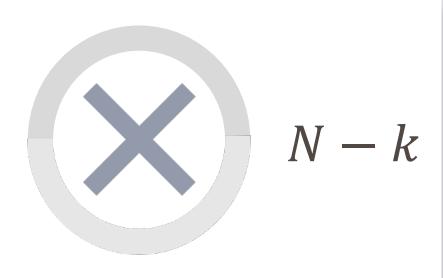
Hypergeometric Distribution

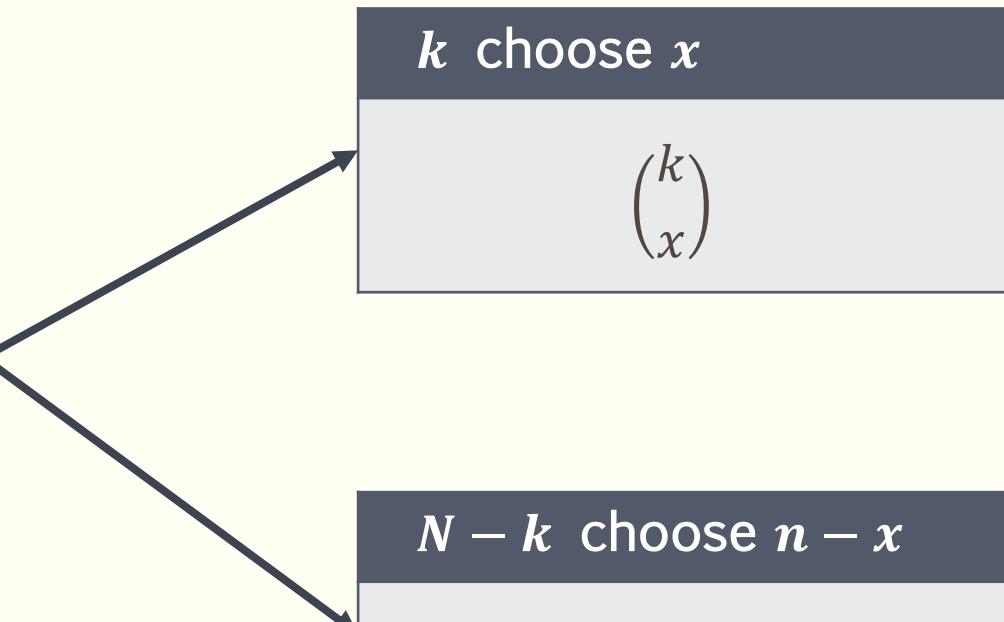
$$N = 12, n = 5, k = 6, x = 3$$

$$H(N, k, n, x) = \frac{\binom{k}{x} \binom{N-k}{n-x}}{\binom{N}{n}} = \frac{\binom{6}{3} \binom{6}{2}}{\binom{12}{5}}$$

$N$  choose  $n$  samples

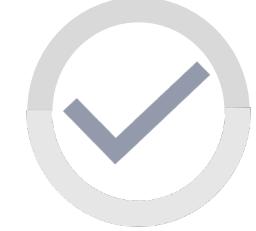
$$\binom{N}{n}$$

  $k$   
  $N - k$



Hypergeometric Distribution

$$H(N, k, n, x) = \frac{\binom{k}{x} \binom{N-k}{n-x}}{\binom{N}{n}}$$

  $k$

  $N - k$

# Hypergeometric Distribution

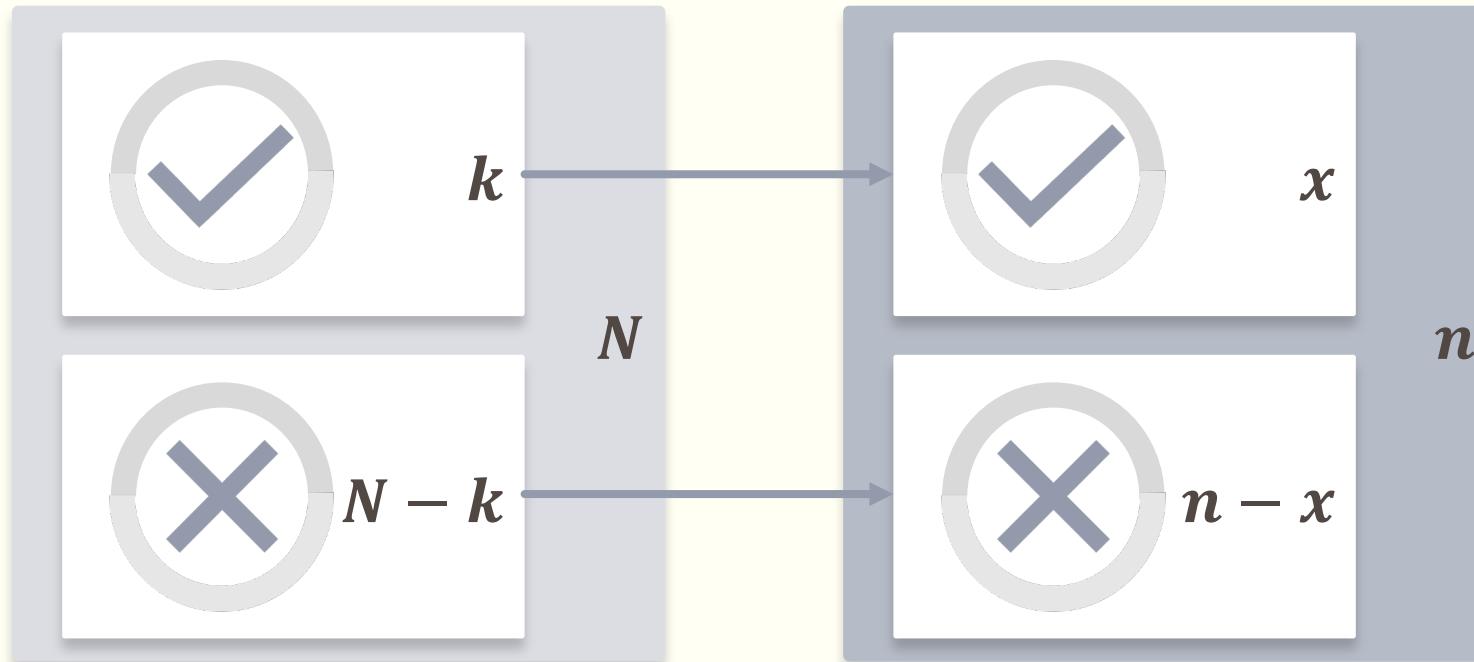
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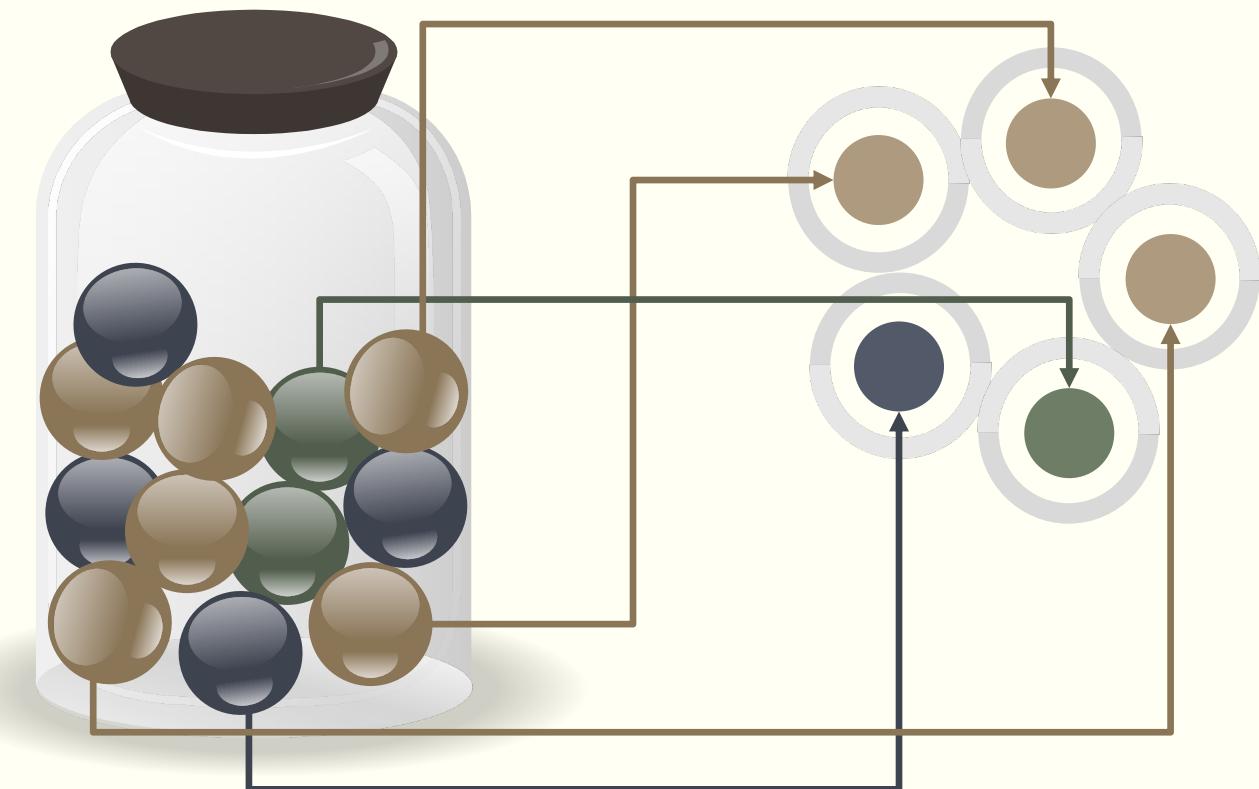
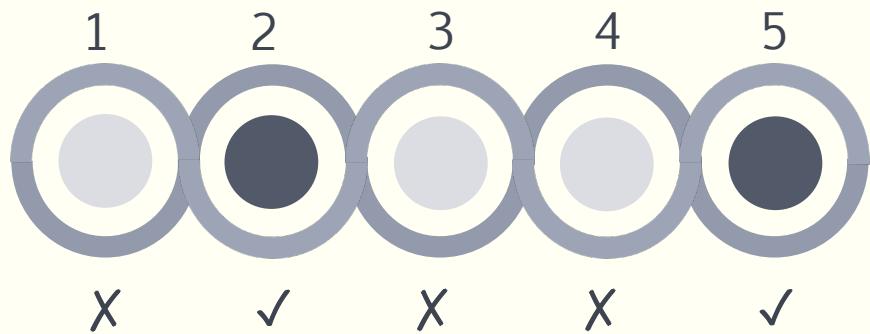
- A finite population of size  $N$ .
- Objects with the desired feature of size  $k$ .
- The probability of  $x$  successes in  $n$  draws.

Hypergeometric Distribution

$$H(N, k, n, x) = \frac{\binom{k}{x} \binom{N-k}{n-x}}{\binom{N}{n}}$$



# Binomial Distribution VS Hypergeometric Distribution



with replacement

!

without replacement

!

# Binomial Distribution VS Hypergeometric Distribution

with replacement

!

without replacement

!

- Let  $p = k/N$  remain constant as  $k$  and  $N$  approach  $\infty$ .
- It recovers to binomial distribution with parameters  $n$  and  $p$ .



$k$



$N - k$



with replacement

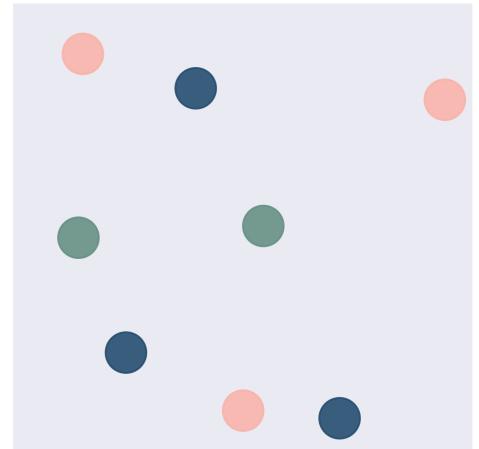
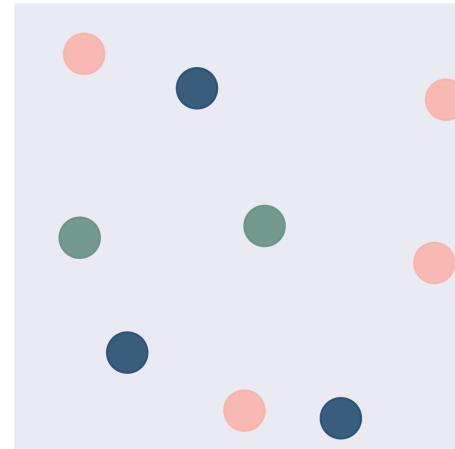
!

- Let  $p = k/N$  remain constant as  $k$  and  $N$  approach  $\infty$ .
- It recovers to binomial distribution with parameters  $n$  and  $p$ .

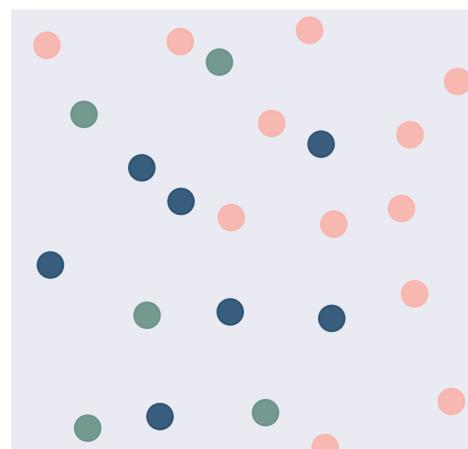
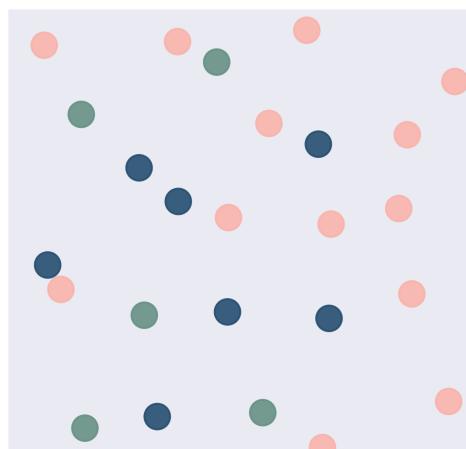
without replacement

!

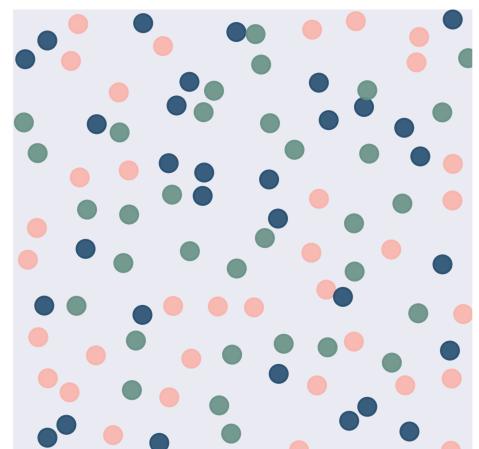
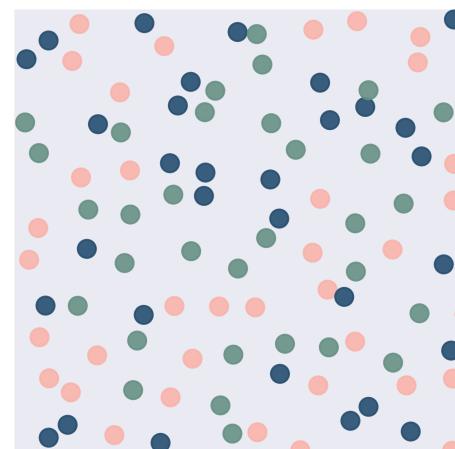
$N = 9$



$N = 25$



$N = 100$



# Example



## Voting

A shareholders' meeting has 105 female voters and 95 male voters. A random sample of 10 voters is drawn. What is the probability exactly 7 of the voters will be female?

### Hypergeometric Distribution

$$H(N, k, n, x) = \frac{\binom{k}{x} \binom{N-k}{n-x}}{\binom{N}{n}}$$



## Voting

A shareholders' meeting has 105 female voters and 95 male voters. A random sample of 10 voters is drawn. What is the probability exactly 7 of the voters will be female?

### Hypergeometric Distribution

$$N = 200, k = 105, n = 10, x = 7$$

$$H(N, k, n, x) = \frac{\binom{k}{x} \binom{N-k}{n-x}}{\binom{N}{n}} = H(200, 105, 10, 7) = \frac{\binom{105}{7} \binom{95}{3}}{\binom{200}{10}}$$



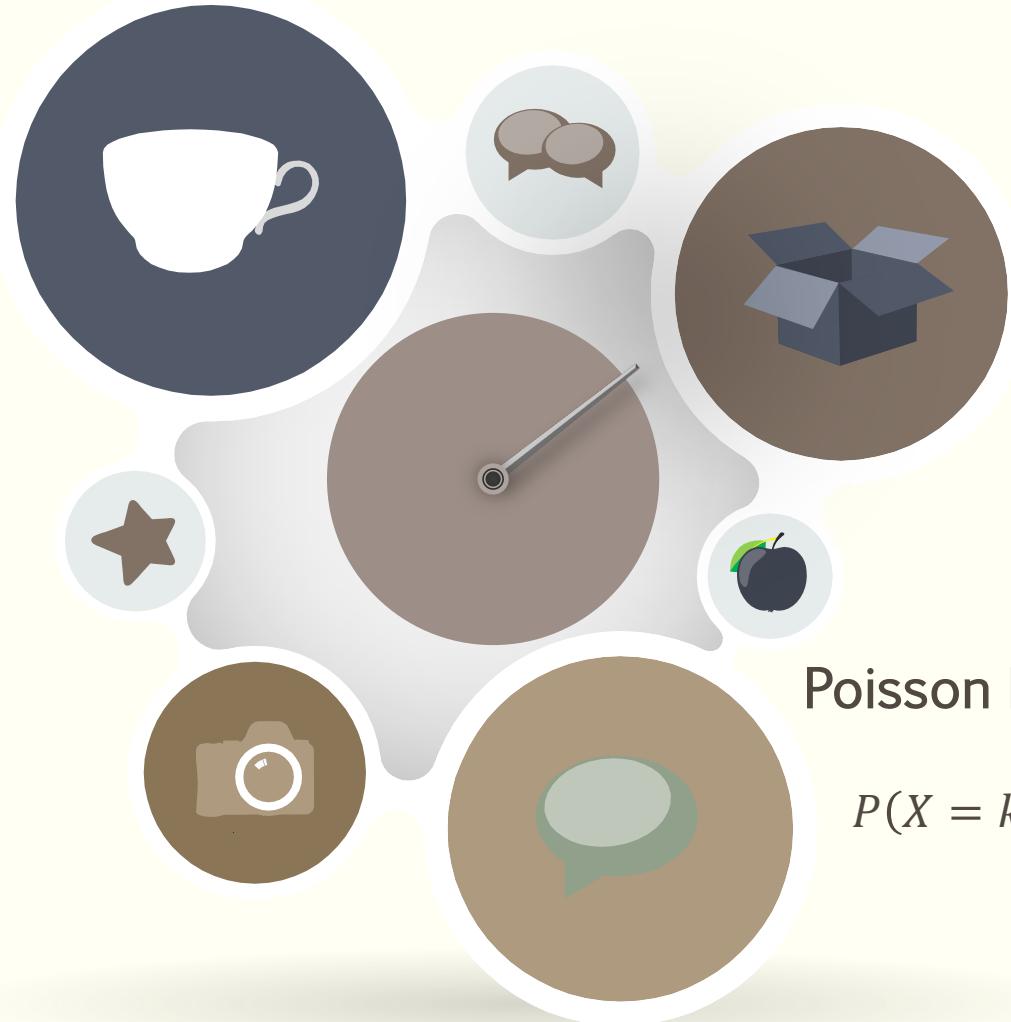
# RICHARD FEYNMAN

“I learned very early the difference between knowing the name of something and knowing something.”



## Binomial distribution

$$b(n, p, k) = \binom{n}{k} p^k q^{n-k}$$



## Poisson Distribution

$$P(X = k) = \frac{\lambda^k}{k!} e^{-\lambda}$$

## Integers or non-integers?

Can  $n$  be a non-integer?

?

Can  $k$  be a non-integer?

?

Can  $\lambda$  be a non-integer?

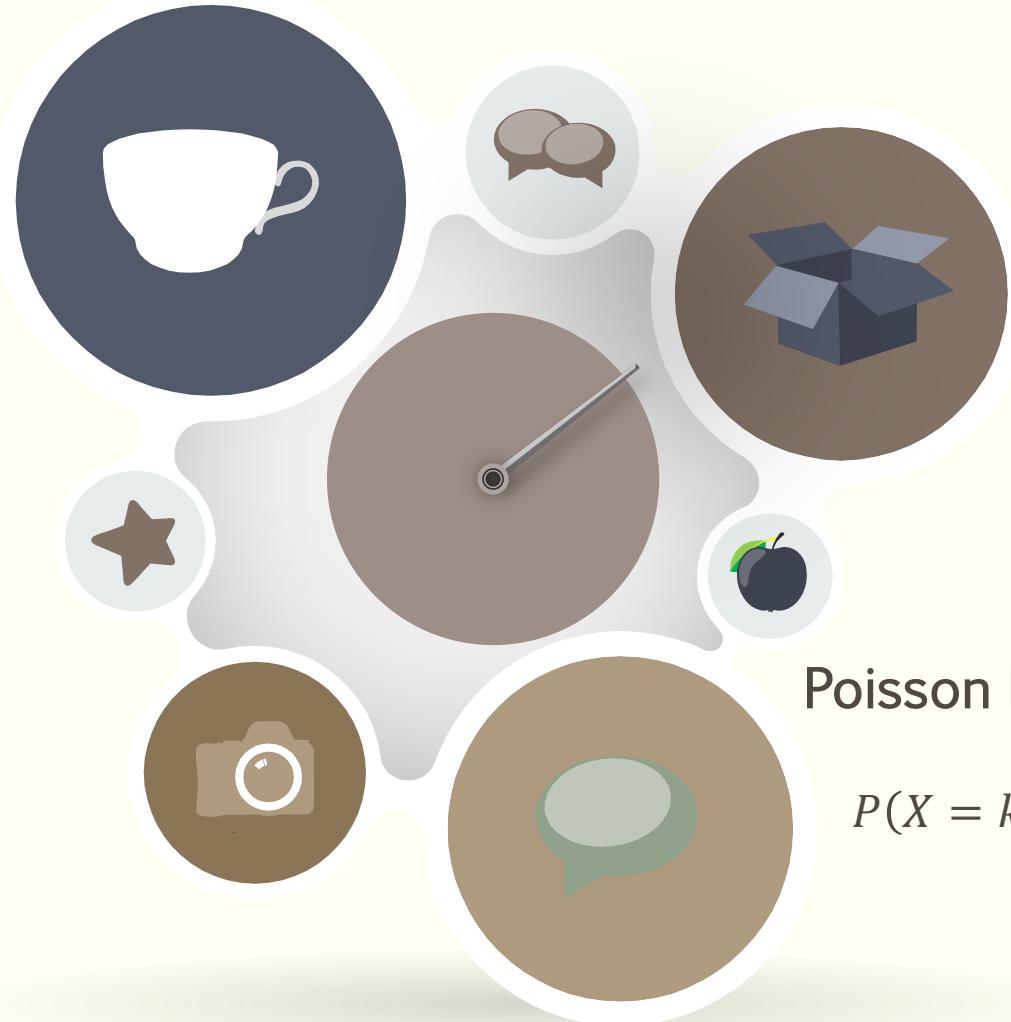
?

Can  $\lambda$  be negative?

?

## Binomial distribution

$$b(n, p, k) = \binom{n}{k} p^k q^{n-k}$$



## Poisson Distribution

$$P(X = k) = \frac{\lambda^k}{k!} e^{-\lambda}$$

## Integers or non-integers?

Can  $n$  be a non-integer?

no

Can  $k$  be a non-integer?

no

Can  $\lambda$  be a non-integer?

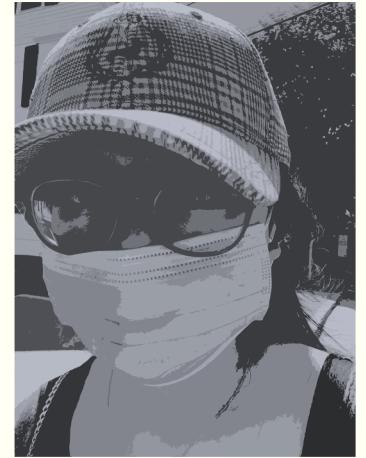
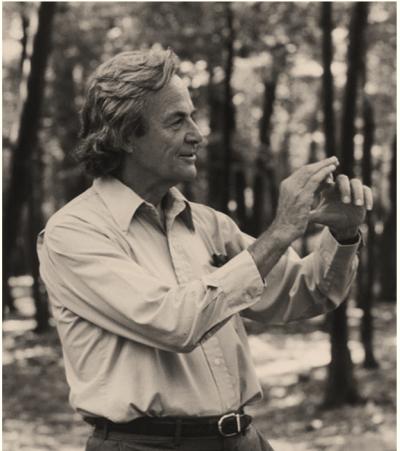
yes

Can  $\lambda$  be negative?

no

“

I really can't do a good job, any job, of explaining **magnetic force** in terms of something else you're more familiar with, because I don't understand it in terms of anything else you're more familiar with.



“

I really can't do a good job, any job, of explaining **Poisson distribution** in terms of something else you're more familiar with, because I don't understand it in terms of anything else you're more familiar with.

# Poisson distribution

$$\frac{3}{4}$$

Magneto Street

Professor X's Book Shop

Poisson distribution:  $\lambda = 3$

Wolverine Street

- Assume that the number of cars that arrive at the fork in unit time has a Poisson distribution with parameter  $\lambda = 4$ .

- Cars coming along Wolverine Street come to a fork in the road and have to choose either Mystique Street or Magneto Street continue.
- Let  $X$  be the random variable which counts the number of cars that, in a given unit of time, pass by Professor X's Book Shop on Magneto Street.
- What is the distribution of  $X$ ?

$$\frac{1}{4}$$

Mystique Street

Poisson distribution:  $\lambda = 1$

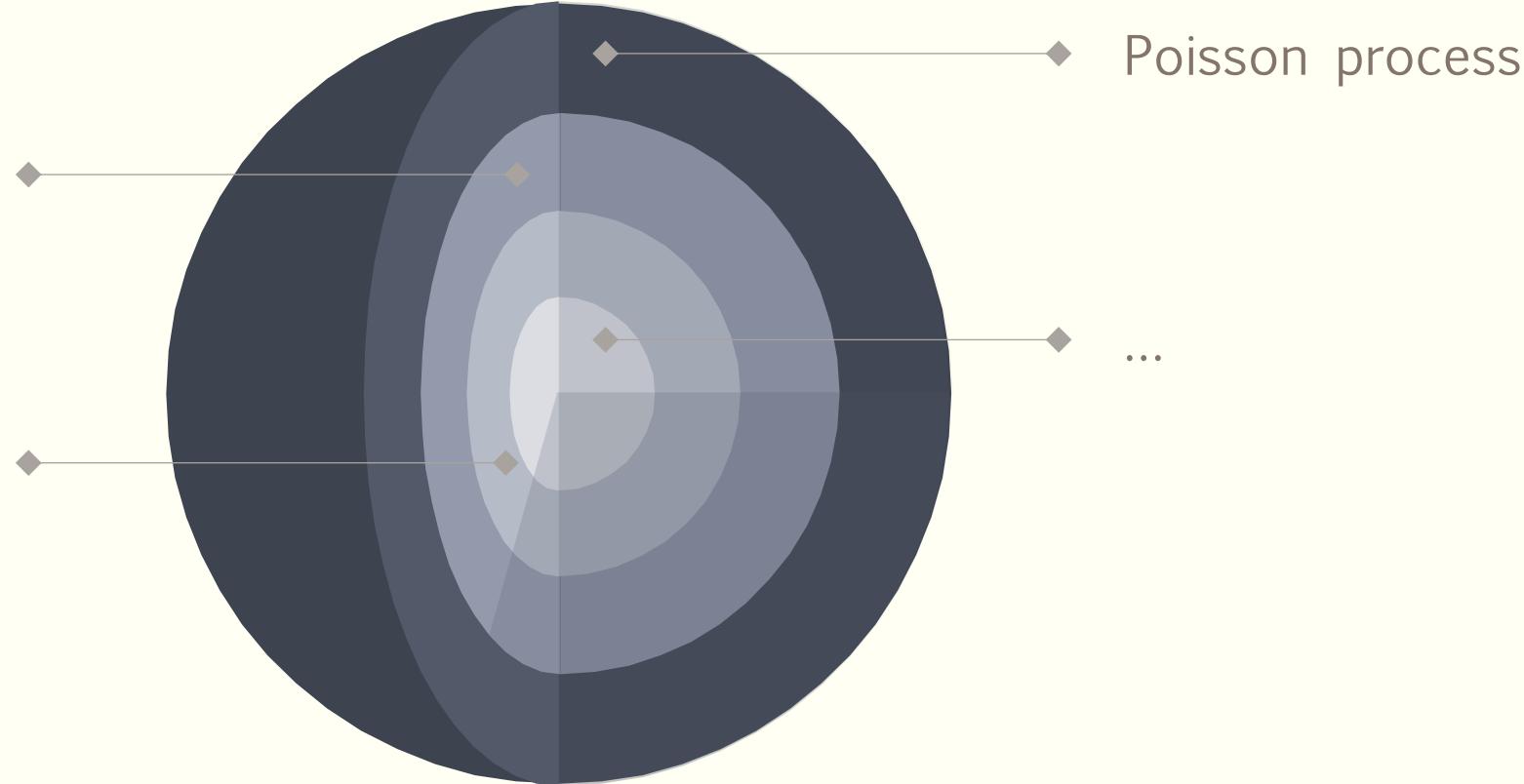
# Poisson Process

Poisson distribution

$$P(X = k) = \frac{\lambda^k}{k!} e^{-\lambda}$$

Exponential distribution

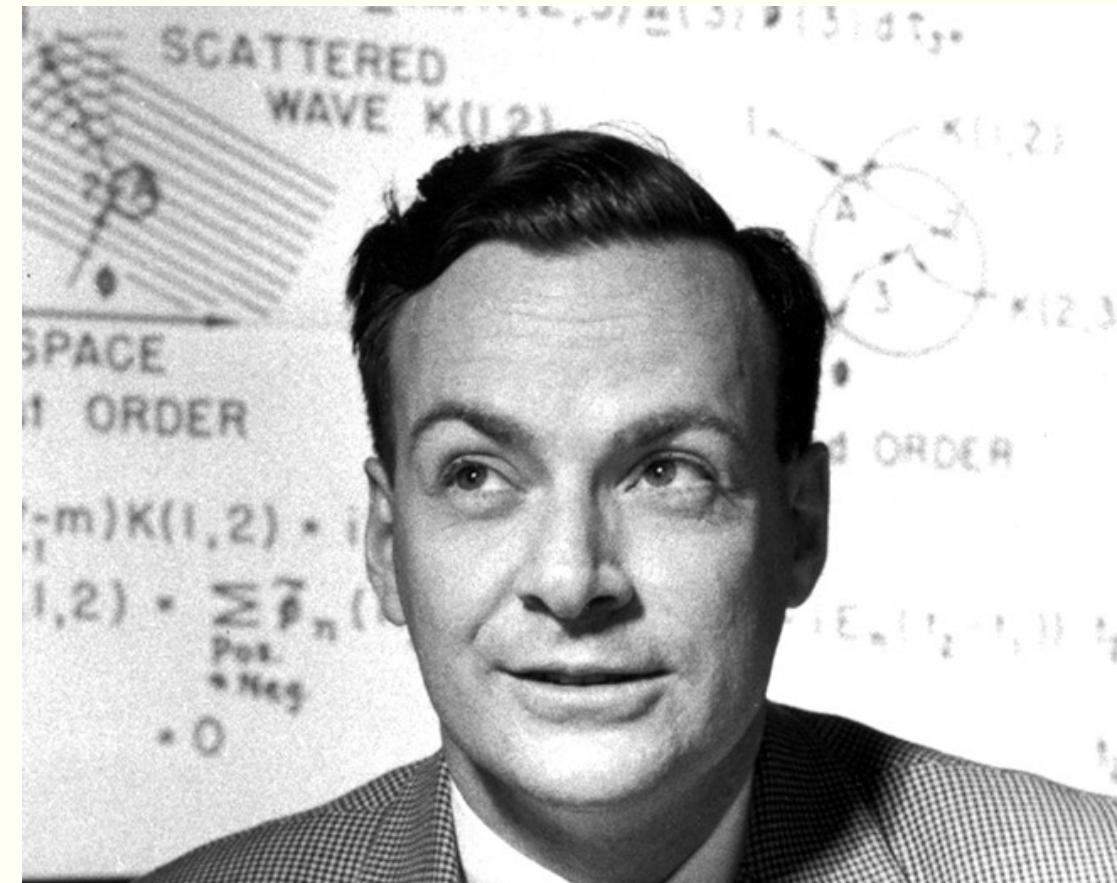
$$f(x) = \begin{cases} \lambda e^{-\lambda x}, & x \geq 0 \\ 0, & x < 0 \end{cases}$$



<b>10 Generating Functions</b>	<b>365</b>
10.1 Discrete Distributions . . . . .	365
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10.3 Continuous Densities . . . . .	393

# RICHARD FEYNMAN

“I think I can safely say that nobody understands quantum mechanics.”





# HOLLYWOOD SCREENWRITERS

When you cannot explain something: use quantum mechanics!





# MATH 20 BABY PROBABILISTS

When you cannot explain something: use Poisson distribution (Poisson process)!

