

# Statistics!

# Probability

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- What exactly is probability?
  - Well it's how probable something is
- Let's think about it a different way
  - Probability is how likely something is to occur
  - You can think of probability as the % chance something happens or is in a certain state

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  - $\sum_{\text{all outcomes}} \text{Probability} = 1$
  - We just logic'ed out a fundamental theorem to probability theory
  - Law of total probability

Let's keep going

- What's the lowest the probability of something happening can be?
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**The probability of something must be between 0 and 1!**

**And the sum of the probability of all outcomes must be 1**

Let's use this to solve a problem

- Say there's a box full of different colored shirts, and the probability of pulling a red shirt out is 0.4
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$$P(\text{red or not red}) = 1 = P(\text{red}) + P(\text{not red}) \quad \textbf{Law of total probability}$$

$$P(\text{not red}) = 1 - P(\text{red}) = 1 - 0.4 = 0.6$$

# Probability of discrete outcomes

- Discrete outcomes are things that are specific
  - Red or not red
  - Heads or tails for a coin
  - 1-6 for a dice
  - Also, counting numbers, or integers
- The function that describes the probability of each outcome is called the Probability Mass Function

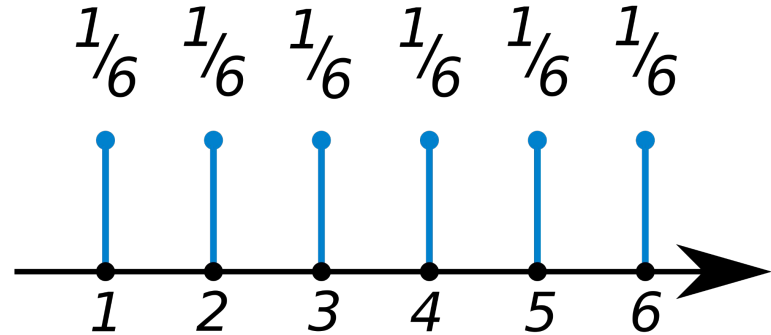
# Probability Mass Function (PMF)

PMF for a coin flip

Heads = 1, tails = 0

$$p_X(x) = \begin{cases} \frac{1}{2}, & x = 0, \\ \frac{1}{2}, & x = 1, \\ 0, & x \notin \{0, 1\}. \end{cases}$$

PMF for a dice roll





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Say I have a digital stopwatch that only goes to the number of seconds,

What is the probability that I could press stop and stop it exactly at 3 seconds?



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Continuous outcomes, are the opposite of discrete

Ex: all decimal numbers

There are infinite outcomes

To have a defined probability it would have to be over an interval

**What's the probability I can stop the analog watch, between 2 s and 4 s?**

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**0**

It has no numbers, remember

But if it did have numbers then the probability would be  $> 0$



If probability is only non-zero over intervals, how do we know how probable something is around some value?

- Probability density function (PDF)
  - $p(x) = dP/dx$
  - The derivative of the probability



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The probability over an interval is then the definite integral

$$P(-2 \leq x \leq 2) = \int_{-2}^2 p(x) dx$$

# Statistics time

Statistics is the study of data

Data is a set of observations

Let's say we have a sample of data,

$$x_i \sim \{x_1, x_2, \dots, x_N\}$$

What are some statistical measures you know?

# Statistics time

Let's say we have a sample of data,

$$x_i \sim \{x_1, x_2, \dots, x_N\}$$

$$\text{mean} = \bar{x} = \frac{1}{N} \sum_{i=1}^N x_i$$

$$x_i \sim \{1, 5, 3\}$$

$$\text{Mean} = (1 + 5 + 3) / 3 = 3$$

$$\text{Variance} = \sigma^2 = \frac{1}{N} \sum_{i=1}^N (x_i - \bar{x})^2$$

$$\text{Var} = ((1-3)^2 + (5-3)^2 + (3-3)^2) / 3 = (4 + 4 + 0) / 3 = 8/3$$

What is variance?

$$\text{Variance} = \sigma^2 = \frac{1}{N} \sum_{i=1}^N (x_i - \bar{x})^2$$

It's the average deviation from the average squared

- The average of the value  $(x - \langle x \rangle)^2$

You may more often here the term standard deviation

standard deviation =  $\sigma = \sqrt{\text{Variance}}$

This is the average distance to the mean

These are measures of how spread out your data is

Going one further there's also a measure called skewness

The average deviation from the mean cubed

$$skew = \frac{1}{N} \sum_{i=1}^N \left( \frac{x_i - \bar{x}}{\sigma} \right)^3$$

This is a measure of how asymmetric your data is

# Moments

The mean, variance, and skew of your data are also known as the first, second, and third moments

These give you the

- Location
- Spread
- Asymmetry

Of the underlying distribution of your data

# Data taking from the perspective of probability theory

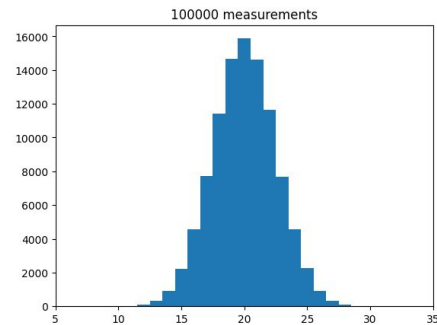
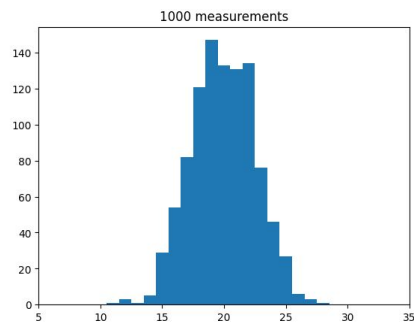
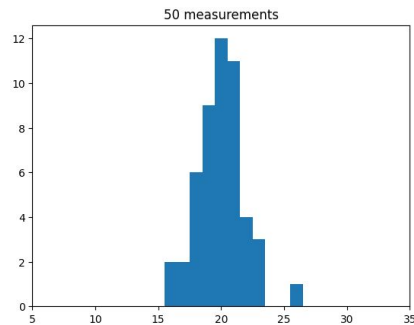
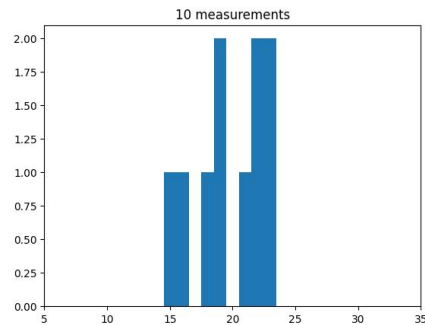
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As you take more data the underlying distribution becomes more clear

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# Histograms

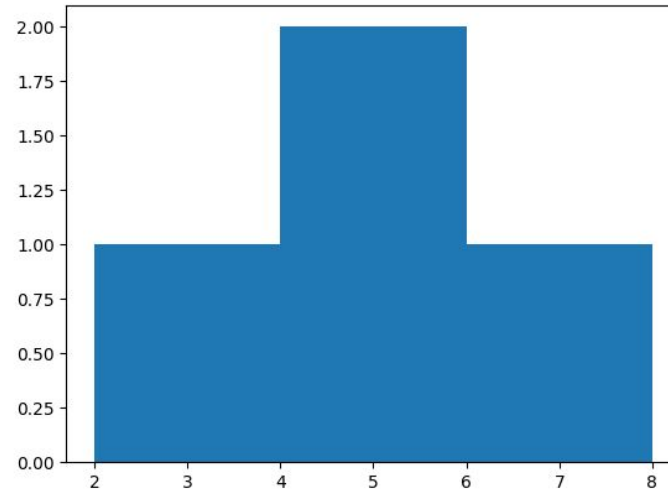
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$x = [2.3, 4.5, 5.5, 7.1]$

Bins = [2, 4, 6, 8]

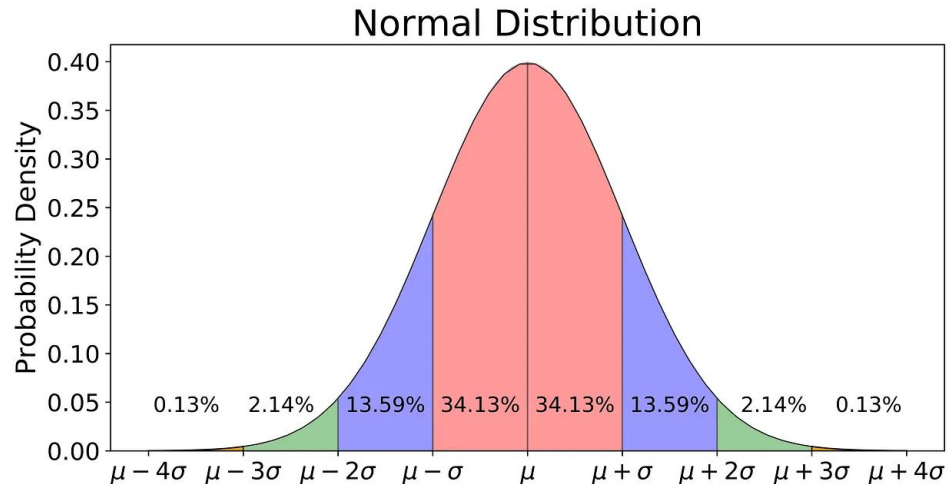


# Normal distribution

One of the most common probability distributions is a Normal distribution

Sometimes also known as a Gaussian

$$f(x) = \frac{1}{\sigma\sqrt{2\pi}} e^{-\frac{1}{2}\left(\frac{x-\mu}{\sigma}\right)^2}$$



# Normal distribution

Normal distributions are so common due to something called the Central Limit Theorem -

If you take the average of many data samples all from the same underlying distribution, those averages will follow a Normal distribution

Let's move on to the tutorial to see an example of this