



Lecture 1

Data Analysis Algorithm I: Statistics

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Lecture 0

1. Self Introduction

Let's know each other :)

2. Discussion: What is Data Analysis?

What is your current understanding? Introduce your relevant experience.

3. Pipeline and Useful Tools

Learn the basic concepts and tools

4. Algorithm I: Statistics

Probability Distribution; Hypothesis Test

Lecture 1

5. Algorithm II: Mathematical Modelling

Build Models with Pre-knowledge

6. Algorithm III: Machine Learning

The Modern Technique

The Very Basic Example

The easiest case: Flip a coin

Case	Probability
Head	0.5
Tail	0.5

Question: What if you repeat for multiple times?

More Options

Roll a dice

Case	Probability
1	$1/6$
2	$1/6$
3	$1/6$
4	$1/6$
5	$1/6$
6	$1/6$

Non-uniform Distribution

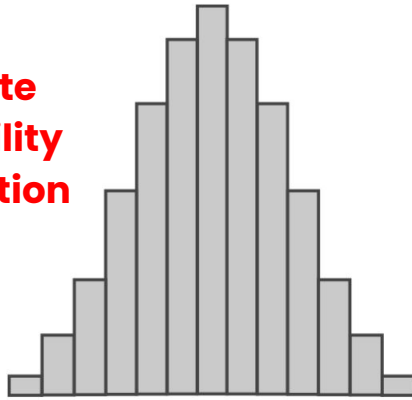
Roll a dice (not uniform)

Case	Probability
1	$1/12$
2	$1/12$
3	$1/3$
4	$1/6$
5	$1/6$
6	$1/6$

PDF (Probability Density Function)

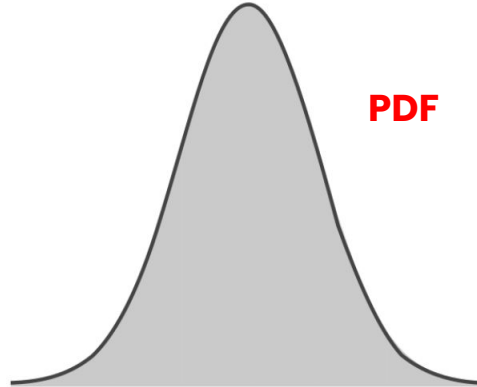
Probability Distributions

**Discrete
Probability
Distribution**



Discrete

PDF



Continuous

**From Discrete
to
Continuous**

(or the opposite)

www.inchcalculator.com

Examples of PDF



Normal



Triangular



Uniform



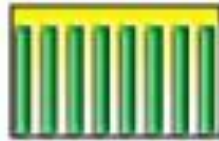
Custom



Lognormal



Binomial



Discrete Uniform



Poisson



Exponential

Probability Distributions have **various forms**

Example: Gaussian Distribution

Normal Distribution Formula

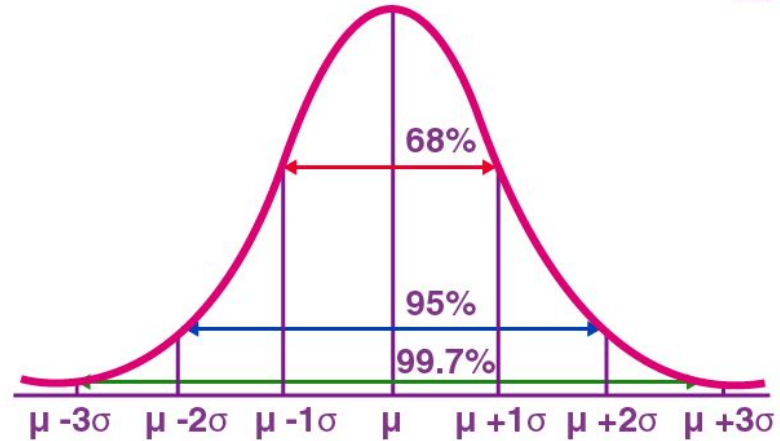
$$f(x) = \frac{1}{\sigma\sqrt{2\pi}} e^{-\frac{(x-\mu)^2}{2\sigma^2}}$$

μ = mean of x

σ = standard deviation of x

$\pi \approx 3.14159 \dots$

$e \approx 2.71828 \dots$



Hypothesis Test: p-value

Easiest case for **null hypothesis test**: Find the **p-value**

When you have only 1 hypothesis

the probability of obtaining test results **at least as extreme** as the result actually observed, under the assumption that the null hypothesis is correct

“Extreme” doesn’t have a unique definition. There are lots of choices

Hypothesis Test: p-value

Let's go back to the coin flipping example

Case	Probability
Head	0.5
Tail	0.5

Data: Number of Heads after repeating for 100 times

Hypothesis: The coin is uniform (probability is 0.5-0.5)

Hypothesis Test: p-value

With the binomial test formula:

Binomial Distribution Formula



$$P(x) = \binom{n}{x} p^x q^{n-x} = \frac{n!}{(n-x)!x!} p^x q^{n-x}$$

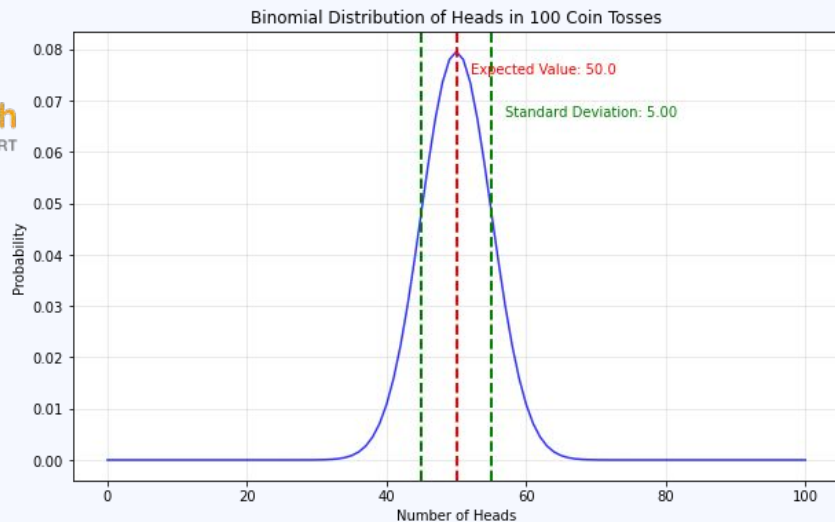
where

n = the number of trials (or the number being sampled)

x = the number of successes desired

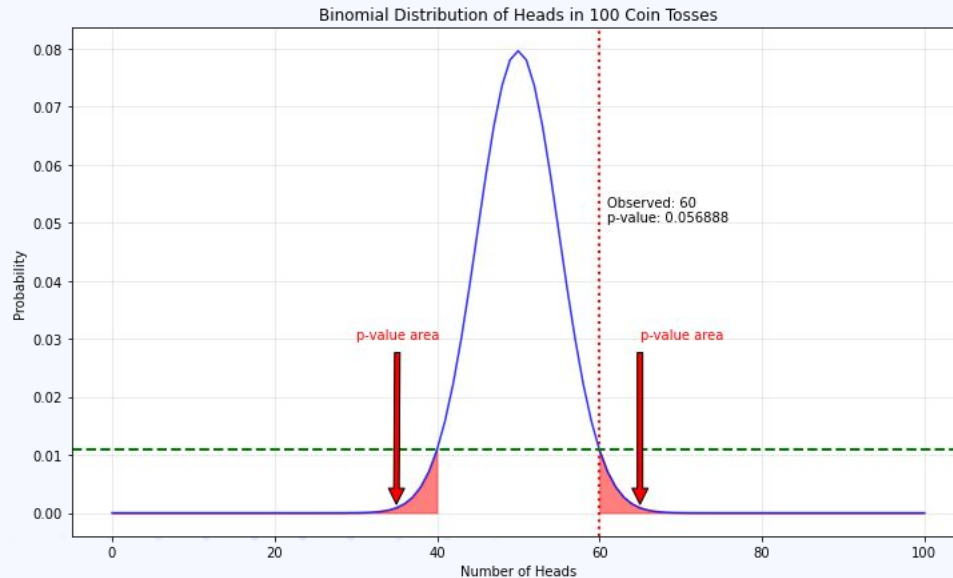
p = probability of getting a success in one trial

$q = 1 - p$ = the probability of getting a failure in one trial



Hypothesis Test: p-value

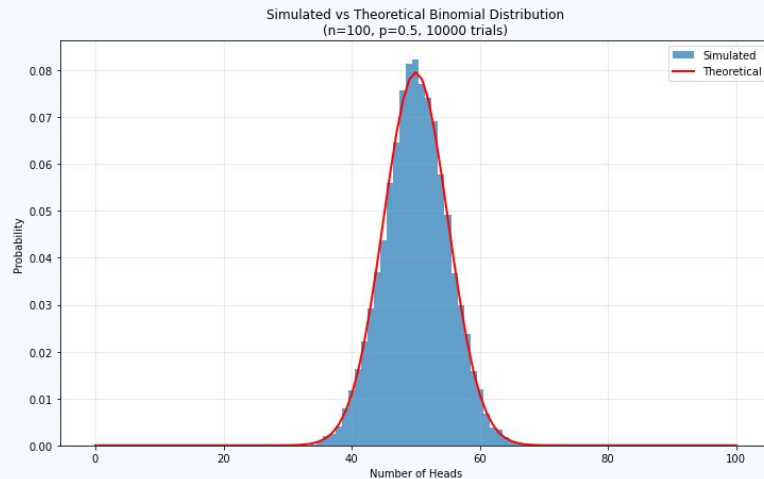
With the binomial test formula:



Hypothesis Test: p-value

Or, we use **Monte Carlo to get PDF**

- For each experiment: we **repeat for 100 times**, record the number of heads (generate 100 random numbers)
- We do **10000 experiments**
- Draw a histogram of the results
- Then we get a numerical PDF



Homework

Try to play with and read the code, then do the following tasks:

- Try to use a **non-uniform coin** (set the value to $<$ or >0.5), and check the results (**attach some plots**).
- For the dice rolling case, which data can we choose to judge the uniformity? Explain your idea.
- Explain what is histogram in your own words, and try to adjust the **binning of the histogram** for the numerical simulation (**attach some plots**)
- For the numerical method, how many “experiment” do we need? Can you come up with a way to judge if it’s enough?