

# Monte Carlo Algorithm (10C)

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# Monte Carlo

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- Monte Carlo Method (Monte Carlo Simulation)
- Monte Carlo Algorithm

# Monte Carlo Method

a broad class of computational algorithms that rely on **repeated random sampling** to obtain numerical results.

Their essential idea is using **randomness** to solve problems that might be **deterministic** in principle.

They are often used in physical and mathematical problems and are most useful when it is difficult or impossible to use other approaches.

used in three distinct problem classes:

- optimization,
- numerical integration
- generating draws from a probability distribution.

[https://en.wikipedia.org/wiki/Monte\\_Carlo\\_method](https://en.wikipedia.org/wiki/Monte_Carlo_method)

# Patterns of Monte Carlo Methods

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Monte Carlo methods vary, but tend to follow a particular pattern:

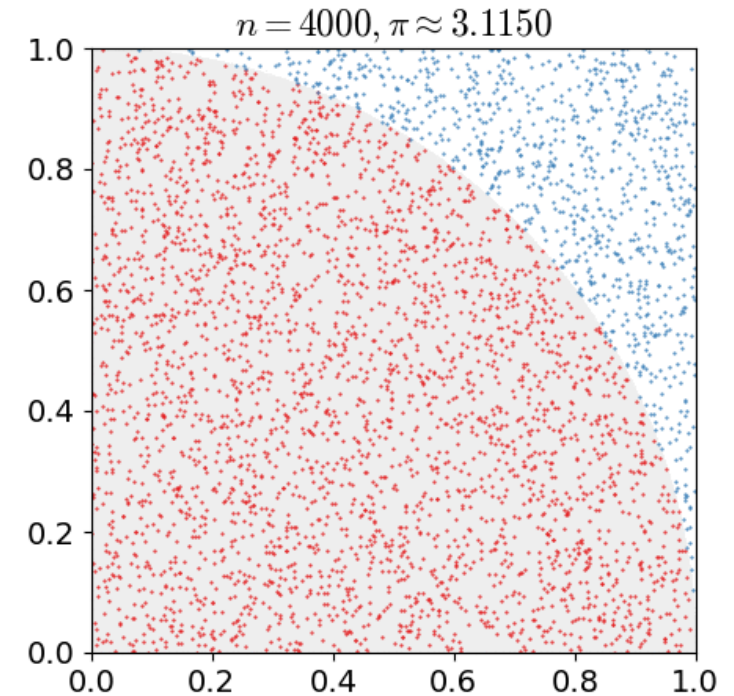
- Define a **domain** of possible inputs.
- **Generate inputs randomly** from a probability distribution over the domain.
- Perform **a deterministic computation** on the inputs.
- **Aggregate** the results.

[https://en.wikipedia.org/wiki/Monte\\_Carlo\\_method](https://en.wikipedia.org/wiki/Monte_Carlo_method)

# Examples of Monte Carlo Methods

For example, consider a circle inscribed in a unit square. Given that the circle and the square have a ratio of areas that is  $\pi/4$ , the value of  $\pi$  can be approximated using a Monte Carlo method:

- 1) Draw a **square**, then inscribe a **circle** within it.
- 2) **Uniformly scatter** objects of uniform size over the square.
- 3) **Count the number** of objects inside the circle and the total number of objects.
- 4) The **ratio** of the **inside-count** and the **total-sample-count** is an estimate of the ratio of the two areas, which is  $\pi/4$ . Multiply the result by 4 to estimate  $\pi$ .



[https://en.wikipedia.org/wiki/Monte\\_Carlo\\_method#/media/File:Pi\\_30K.gif](https://en.wikipedia.org/wiki/Monte_Carlo_method#/media/File:Pi_30K.gif)

[https://en.wikipedia.org/wiki/Monte\\_Carlo\\_method](https://en.wikipedia.org/wiki/Monte_Carlo_method)

# Monte Carlo Algorithms

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In computing, a Monte Carlo algorithm is a **randomized algorithm** whose output *may be incorrect* with a certain (typically small) probability.

The name refers to the grand casino in the Principality of Monaco at Monte Carlo, which is well-known around the world as an icon of gambling.

[https://en.wikipedia.org/wiki/Monte\\_Carlo\\_algorithm](https://en.wikipedia.org/wiki/Monte_Carlo_algorithm)

# One-sided and Two-sided Errors

a **deterministic** algorithm returns a correct answer

a **Monte Carlo** algorithm does *not always* return a correct answer

## one-sided error algorithms

**false-biased** algorithms : correct false answer

**true-biased** algorithms : correct true answer

a **false-biased** Monte Carlo algorithm is **always correct** when it returns **false**

a **true-biased** Monte Carlo algorithm is **always correct** when it returns **true**.

## two-sided error algorithms

**no bias**

the answer they provide (either **true** or **false**) will be **incorrect**, or **correct**, with some bounded probability.

[https://en.wikipedia.org/wiki/Monte\\_Carlo\\_algorithm](https://en.wikipedia.org/wiki/Monte_Carlo_algorithm)



# Amplification

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For a Monte Carlo algorithm with one-sided errors,  
the **failure** probability can be **reduced**  
and the **success** probability **amplified**  
by running the algorithm **k times**.

[https://en.wikipedia.org/wiki/Monte\\_Carlo\\_algorithm](https://en.wikipedia.org/wiki/Monte_Carlo_algorithm)

# The Solovay–Strassen primality test (1)

determine whether a given number is a prime number

for prime number inputs, it always answers true;

for composite inputs, it answers  
**false** with probability at least  $\frac{1}{2}$  and  
**true** with probability less than  $\frac{1}{2}$ .

Thus, **false** answers from the algorithm are certain to be correct,  
whereas the true answers remain *uncertain*;

**a  $\frac{1}{2}$ -correct false-biased algorithm**

[https://en.wikipedia.org/wiki/Monte\\_Carlo\\_algorithm](https://en.wikipedia.org/wiki/Monte_Carlo_algorithm)

# The Solovay–Strassen primality test (2)

One may run this algorithm multiple times returning a false answer if it reaches a false response **within  $k$  iterations**, and otherwise returning true.

Thus, **if the number is prime** then the answer is **always correct**, and **if the number is composite** then the answer is **correct with probability** at least  $1 - (1 - 1/2)^k = 1 - 2^{-k}$ .

[https://en.wikipedia.org/wiki/Monte\\_Carlo\\_algorithm](https://en.wikipedia.org/wiki/Monte_Carlo_algorithm)



## References

- [1] <http://en.wikipedia.org/>
- [2] [https://en.wikiversity.org/wiki/Understanding\\_Information\\_Theory](https://en.wikiversity.org/wiki/Understanding_Information_Theory)