# Programming Techniques 2024-2025 Barnes-Hut Algorithm

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# Problem: Direct simulation leads to $O(N^2)$ scaling

- ▶ We need to calculate the forces between all the particles in the simulation.
- ▶ The number of force calculations depends on the number of particles, *N*:
  - $N = 2 \Rightarrow 1$  calculation
  - $N = 3 \Rightarrow 3$  calculations
  - $N = 4 \Rightarrow 6$  calculations
  - $N = 10 \Rightarrow 45$  calculations
  - $N = 100 \Rightarrow 4950$  calculations
  - $N = 1000 \Rightarrow 499\,500$  calculations
- ► Computational complexity:  $\frac{1}{2}N(N-1) \sim N^2$
- ▶ Called  $O(N^2)$  scaling.



# Computational Scaling

$$T_{N=100}/T_{N=10}=100$$

$$T_{N=1000}/T_{N=100}=100$$

$$T_{N=10\,000}/T_{N=1000}=100$$

$$T_{N=10\,000}/T_{N=10}=1\,000\,000$$

# Computational Scaling

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$$T_{N=10\,000}/T_{N=10}=1\,000\,000$$

► Not good!

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$$T_{N=10\,000}/T_{N=10}=1\,000\,000$$

► Not good at all!



## What can we do?

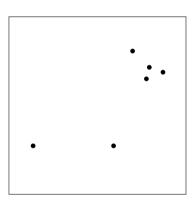
- Find an algorithm that scales better.
- ► Barnes-Hut Algorithm (Nature, V. 324 1986)
- ightharpoonup Scales as  $O(N \log N)$
- $T_{N=100}/T_{N=10}=20$
- $T_{N=1000}/T_{N=100}=15$
- $T_{N=10\,000}/T_{N=1000}=13$
- $T_{N=10\,000}/T_{N=10}=4000$

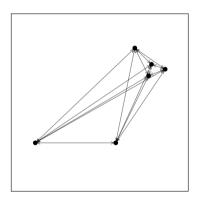
How?

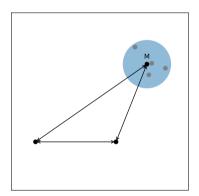


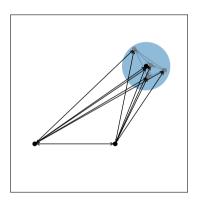
# How?

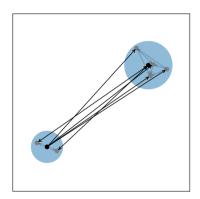
Approximate far-away clumps of particles as point masses.











### How?

Use a spatial data structure to organise the particles.

#### Octree:

- A tree data structure that divides 3D space into hierarchical cubes.
- ► A 3D version of a quadtree.

#### Octree node:

- An octree node represents a cube in 3D space.
- Each node can be subdivided into eight smaller cubes (children nodes).
- A node has a link to its parent node.
- In our case, a node can contain:
  - A single particle (either a pointer or an array index).
  - ▶ Total mass of all the particles in the descendant nodes.
  - 3D center of mass.



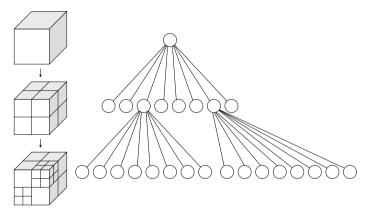
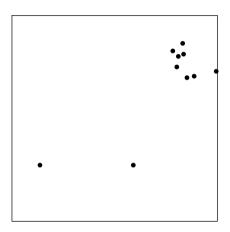
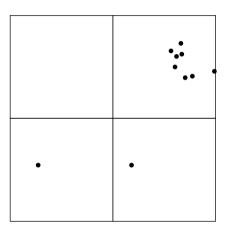
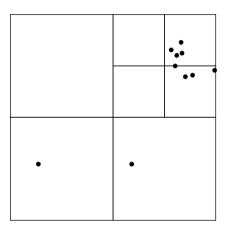
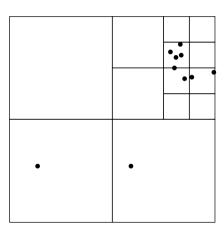


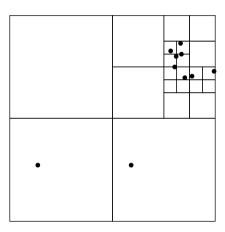
Image by: WhiteTimberwolf: CC BY-SA 3.0



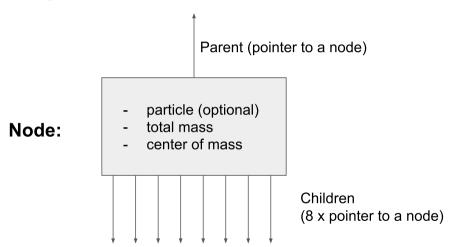








## Octree Node Structure



# Building an Octree

- Find the node the particle belongs to.
- If the node is empty, assign the particle to the node.
- ▶ If the node already contains a particle:
  - Subdivide the node.
  - Move the existing particle to the correct child node.
  - Try to assign the new particle to the correct child node.
  - If the child node already has a particle, subdivide again.
- Recursive subdivision makes this process clean and efficient.