

# The Barnes-Hut-Algorithm

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# Introduction and Motivation

# N-Body Systems

System of  $N$  particles:

- $i$ -th particle characterized by its position  $\mathbf{r}_i$ , velocity  $\mathbf{v}_i$ , mass  $m_i$  (and charge  $q_i$ , ...)
- interaction via gravitational force  $F_i = \sum_{i \neq j} Gm_i m_j \frac{\mathbf{r}_j - \mathbf{r}_i}{|\mathbf{r}_j - \mathbf{r}_i|^3}$  (or Coulomb-force, ...)
- can be studied in 1, 2, 3 or even more spatial dimensions

Model for:

- astronomical objects, systems of galaxies
- plasmas
- ...

# Solution of $N$ -Body Problems

Analytical solution for

- 2-body systems
- certain cases of 3-body systems

⇒ In general, numerical treatment is necessary.

**Naive approach:** Compute force as the sum shown above and plug it into integrator for ODEs.

# Problem with Naive Approach

- force acts over a long range
- force on a particular particle depends on all other particles
- problems with high numbers of particles ( $N > 10^6$ ) are relevant and interesting

⇒ Naive approach does not scale well with number of particles ( $\sim \mathcal{O}(N^2)$ ) and does thus not allow for treatment of realistic problems.

# History I

Algorithm developed in 1986.

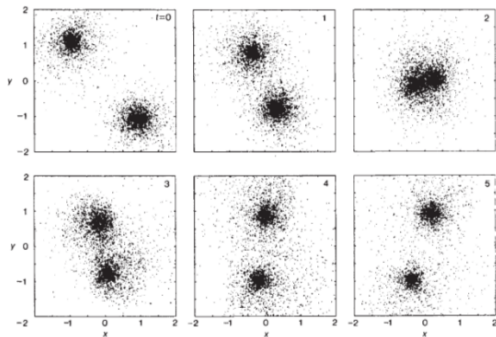


Joshua Barnes  
Institute for Astronomy (IFA)  
University of Hawaii



Piet Hut  
Institute for Advanced Study  
Princeton

# History II



$N = 4096$

runtime  $\approx 10$  h



VAX 11/780

5 MHz

$\leq 8$  MB RAM



# The Barnes-Hut-Algorithm

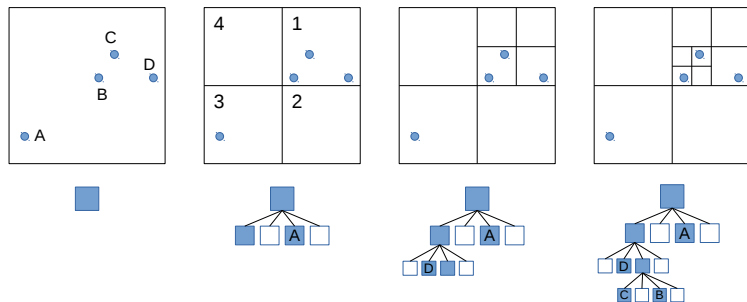
## Idea: Boil down calculation of force

Treat “lumps” of particles like one big macro particle if distance is large enough, in order to reduce the number of direct interactions.



# Tree structure

Use tree structure (binary tree, quad-tree or octree, depending on dimensionality) to give notion of “lumps” a well-defined meaning.

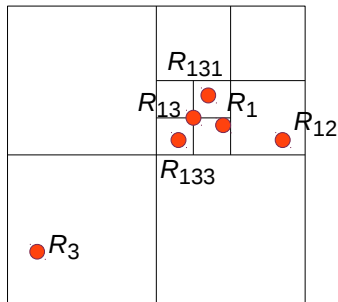
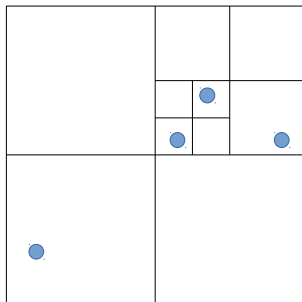


In the tree, close particles are grouped under the same nodes.

## Nodes as Macro-Particles

Each node is assigned a mass and a position, on the basis of the particles it and its subnodes contain:

- total mass:  $M = \sum_i m_i$
- center of mass:  $\mathbf{R} = (\sum_i \mathbf{r}_i m_i) / M$



## Building the Tree

In the program, the following recursive procedure is used for building the tree (pseudocode):

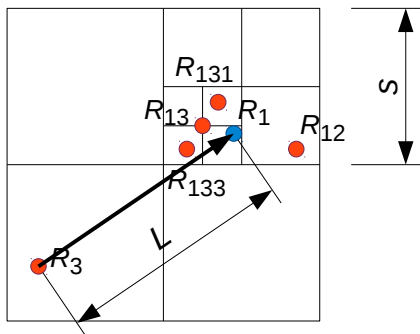
```
function insert(node, particle)
  if (has_children(node))
    quadrant ← get_quadrant(node, particle)
    insert(child(node, quadrant), particle)
  else if (is_empty(node))
    add_particle(node)
  else
    create_children(node)
    quadrant ← get_quadrant(node, particle)
    insert(child(node, quadrant), particle)
    node_particle ← get_particle(node)
    quadrant ← get_quadrant(node, node_particle)
    insert(child(node, quadrant), node_particle)
    remove_particle_from_node(node)
```

## Calculating the Force

Compare width  $s$  of node with distance  $L$ , threshold for approximation is

$$\frac{s}{L} < \Theta$$

(typically,  $\Theta = 0.5$ ;  $\Theta = 0$  corresponds to naive approach). If ratio is larger, go deeper into the tree.



# Implementation of Force calculation

```
function get_force(node, particle)
  if (width(node)/distance(node, particle) < theta)
    return calculate_force(node, particle)
  else if (has_children(node))
    force <- 0
    for each child in get_children(node)
      force <- force + get_force(child, particle)
    return force
  else if (is_empty(node))
    return 0
  else
    node_particle <- get_particle(node)
    return calculate_force(node_particle, particle)
```

# Order of the Algorithm

- depth of tree scales roughly with  $\log(N)$
- costs for building tree scale like product of  $N$  with average depth of tree
- costs for calculating the force scale like product of  $N$  with average depth of tree

⇒ On average we have  $\mathcal{O}(N \log N)$ , which is much better than  $\mathcal{O}(N^2)$ .

**Problem:** Depends very much on the distribution of particles,  $\Theta$ , etc.



# Adjustments

What can be varied?

- $\Theta$
- maximum number of particles per node
- maximum depth of tree
- integrator for ODE
- way of building the tree might be made more efficient
- ...

Pros and Cons, Alternatives

# Pros and Cons

## Pros:

- makes large  $N$  feasible
- possible to use parallelisation techniques
- easy to understand and implement
- does not depend on a certain kind of interaction

## Cons:

- hard to control what actually happens
- efficiency depends on the situation, e.g. high densities lead to poor performance due to deep tree
- significant overhead if applied in wrong situation
- energy and momentum not conserved
- does not take into account higher moments

# Alternatives

If  $N$  is low, the naive brute force algorithm performs better due to the lack of overhead.

For large  $N$ , especially with high densities, mesh-based methods are an alternative to tree based methods.