

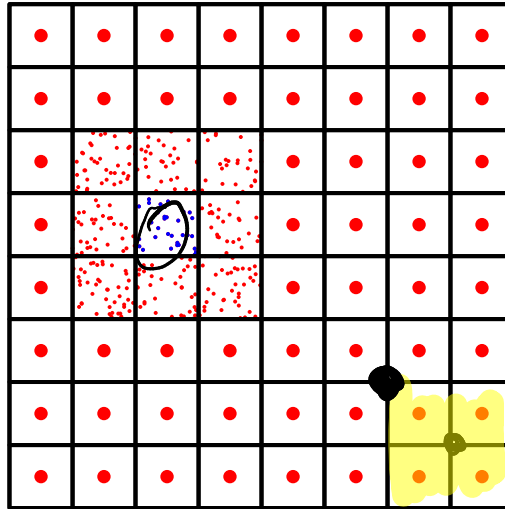
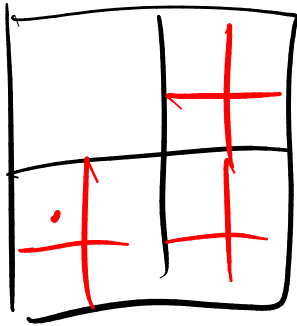
TODAY:

- Barnes-Hut
 - Fast Multipole
 - Direct solver for interaction matrices
- $Ax \rightarrow b$
 $b \rightarrow A^{-1}b$

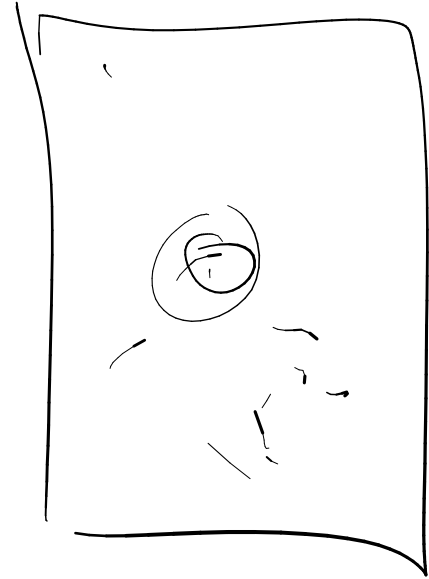
Project submission logistics

Barnes-Hut: Putting Multipole Expansions to Work

$\mathcal{O}(m^2 N_{\text{tree}}^2)$



(Figure credit: G. Martinsson, Boulder)



With this computational outline, what's the accuracy?

Multipole error estimate;

$$\left(\frac{df_s}{dct} \right)^{p+1}$$

Local error estimate;

$$\left(\frac{df_l}{dcs} \right)^{p+1}$$

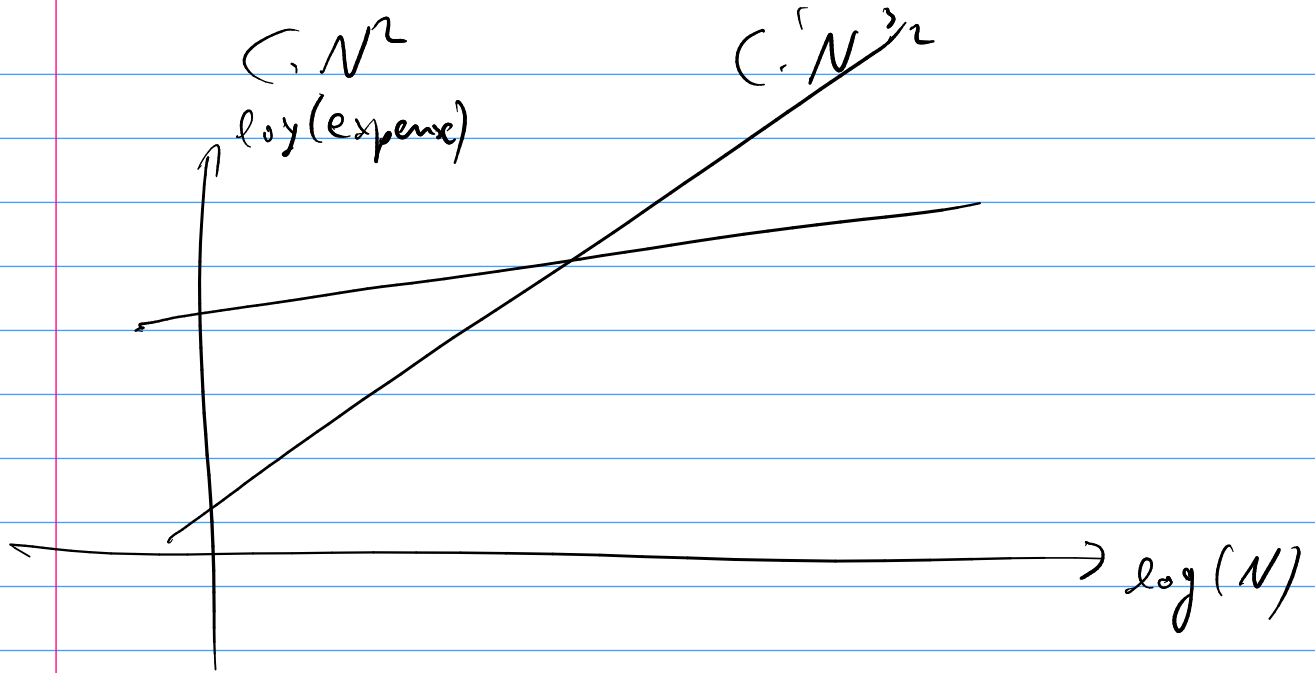


$$df_s = \frac{\sqrt{2}}{2}$$

$$dct = \frac{3}{2}$$

multipole error est: $\left(\frac{\sqrt{2}}{3} \right)^{p+1}$

$z_0 \rightarrow \left(\frac{\sqrt{3}}{3} \right)^{p+1}$



	Evaluable
$N = \frac{N}{m}$	K

N : # particles

m : # particles per box

Barnes-Hut (single-level): Computational Cost

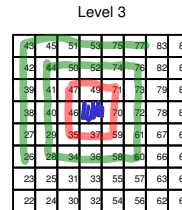
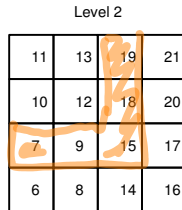
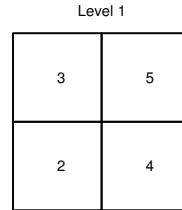
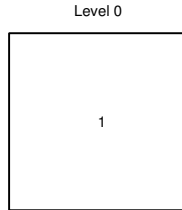
What's the cost of this algorithm?

Barnes-Hut: Putting Multipole Expansions to Work

L levels

$\Rightarrow 4^L$ boxes

$L \approx \log_4 N$



makes sense for
 $O(1)$ particles
 per box

where
 $O(1) \approx 30$

$27 = 6^2 - 3^2$ source boxes on that level

(Figure credit: G. Martinsson, Boulder)

How many levels?

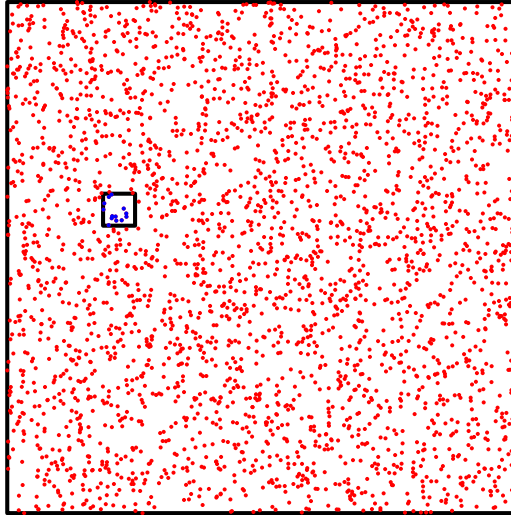
Forming multipoles

	How many	Individual cost
Level L	N/m	$mk \rightarrow O(N)$
Level $L-1$	$N/m \cdot \frac{1}{4}$	$4mk$
Level $L-2$	$N/m \cdot \frac{1}{4^2}$	4^2
Level 1		

Forming all multipoles: $O(N \log N)$

Evaluating all mples: $27 \cdot L \cdot \frac{N}{m}$

Barnes-Hut: Putting Multipole Expansions to Work

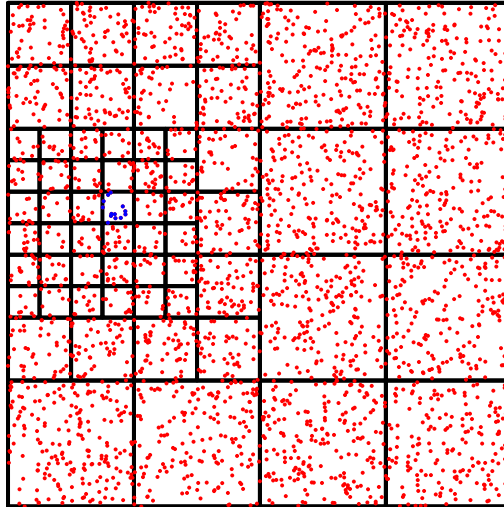


(Figure credit: G. Martinsson, Boulder)

Want to evaluate all the **source** interactions with the **targets** in the box.

Q: What would be good sizes for source boxes? What's the requirement?

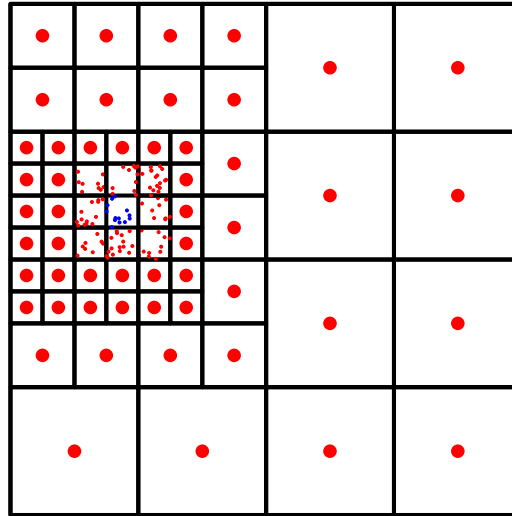
Barnes-Hut: Putting Multipole Expansions to Work



(Figure credit: G. Martinsson, Boulder)

Data from which of these boxes could we bring in using multipole expansions?
Does that depend on the type of expansion? (Taylor/special function vs skeletons)

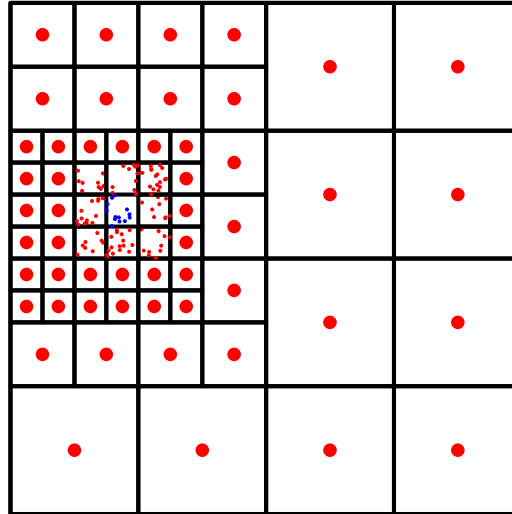
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(Figure credit: G. Martinsson, Boulder)

What properties do these boxes have?

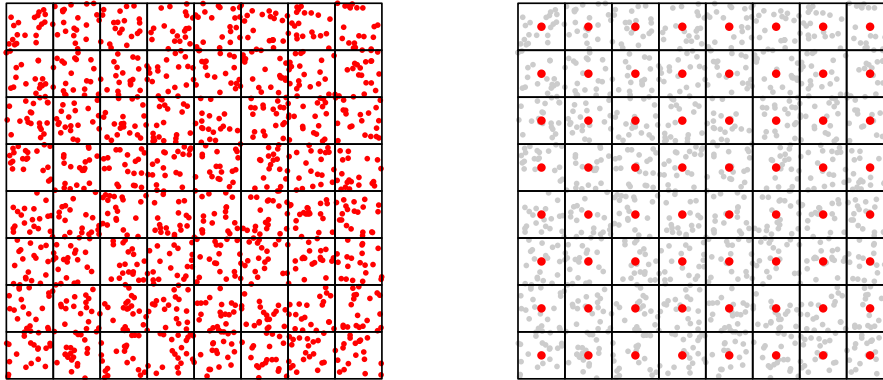
Barnes-Hut: Putting Multiple Expansions to Work



(Figure credit: G. Martinsson, Boulder)

What is the cost of evaluating the [target](#) potentials, assuming that we know the multipole expansions already?

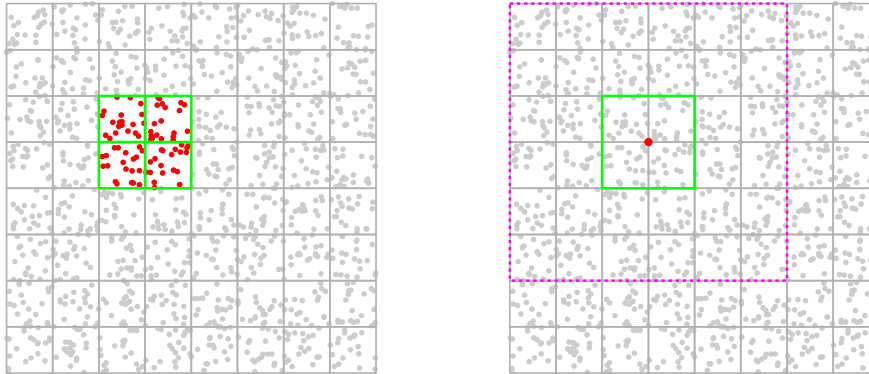
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(Figure credit: G. Martinsson, Boulder)

Summarize the algorithm (so far) and the associated cost.

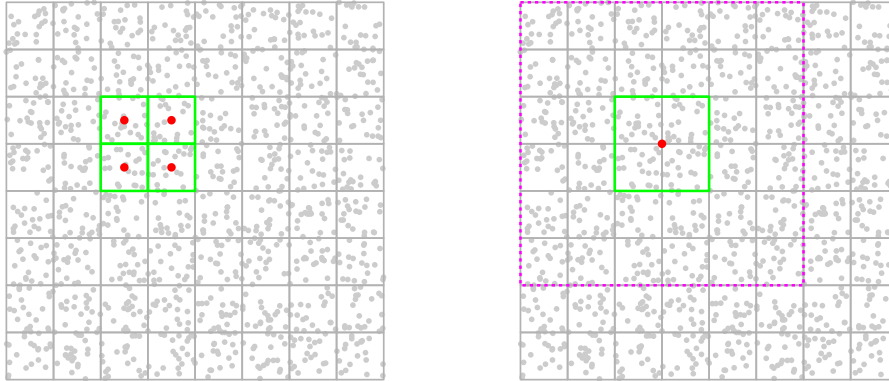
Barnes-Hut: Putting Multipole Expansions to Work



(Figure credit: G. Martinsson, Boulder)

How could this process be sped up?

Barnes-Hut: Putting Multipole Expansions to Work



(Figure credit: G. Martinsson, Boulder)

To get a new 'big' multipole from a 'small' multipole, we need a new mathematical tool.

Cost of Multi-Level Barnes-Hut

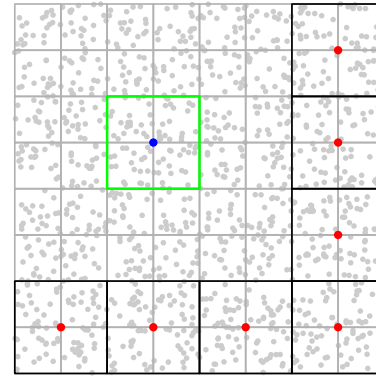
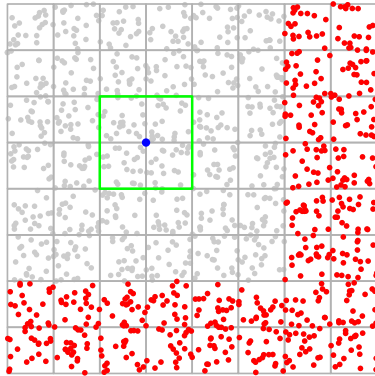
Summarize the cost of the final algorithm (with upward translation)

	How many	Individual cost
$O(N) \rightarrow$ Level L	N/m	k_m
Level $L-1$	$4 \cdot (N/m)$	k^2
Level $L-2$	$4 \cdot (N/m) / 4$	k^2
Level $L-3$	$4 \cdot (N/m) / 4^2$	k^2

$\rightarrow 4 \cdot (N/m) \cdot k^2 \cdot \left(1 + \frac{1}{4} + \frac{1}{16} + \frac{1}{4^3} + \dots \right)$ constant

Using Multipole-to-Local

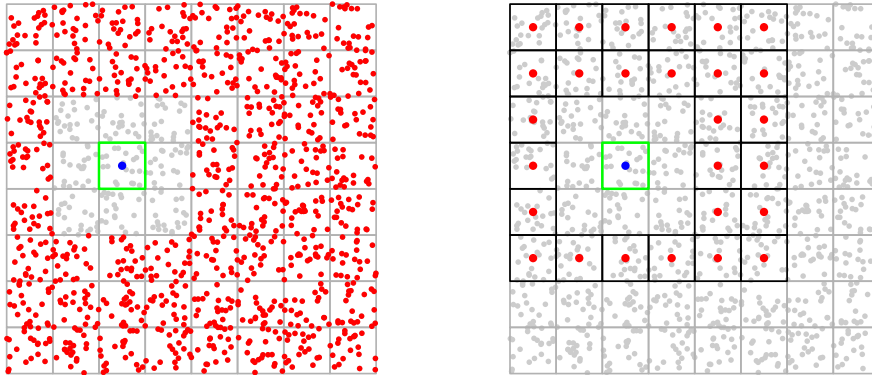
↑ Barnes-Hut



(Figure credit: G. Martinsson, Boulder)

Come up with an algorithm that computes the interaction in the figure.

Using Multipole-to-Local



(Figure credit: G. Martinsson, Boulder)

Assuming we retain information from the previous level, how can we obtain a valid local expansion on the [target](#) box?

Define 'Interaction List'

For a box b , the interaction list I_b consists of all boxes b' so that

The Fast Multipole Method ('FMM')

Upward pass

1. Build tree
2. Compute interaction lists
3. Compute lowest-level multipoles from sources
4. Loop over levels $\ell = L - 1, \dots, 2$:
 - (a) Compute multipoles at level ℓ by mp \rightarrow mp

Downward pass

1. Loop over levels $\ell = 2, 3, \dots, L - 1$:
 - (a) Loop over boxes b on level ℓ :
 - i. Add contrib from l_b to local expansion by mp \rightarrow loc
 - ii. Add contrib from parent to local exp by loc \rightarrow loc
2. Evaluate local expansion and direct contrib from 9 neighbors.

Overall algorithm: Now $O(N)$ complexity.