### Distributed Octrees with Rust and MPI

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#### Points2Octree

- **Goal**: Go from a set of points distributed across processors to an \*unbalanced distributed octree.
- State of the art software tends to use linear trees i.e. only store leaf nodes [1, 2, 3, 4, 5]
- We implement the scheme outlined in [5] augmented with extra features for use with FMM and other solvers using Rust and MPI.

#### Octrees

- Represent each node uniquely with an anchor and its level in the tree.
- e.g. the anchor of d is (4, 2) and it's at level 3.
- Can represent uniquely with tuple (4, 2, 3).

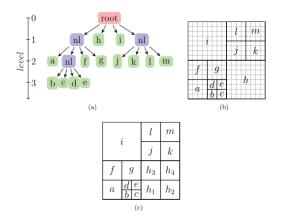


Figure 1: Adapted from [5]

# Nice Properties of Morton Encoding

- Sorting leaves in ascending order of Morton keys is equivalent to pre-order traversal of the leaves. Connecting centres, we observe a 'Z' pattern.
- Encoding preserves spatial locality.
- Given octants a b and c with a < b < c and  $c \notin \{\mathcal{D}(b)\}$   $\implies a < d < c, \forall d \in \{\mathcal{D}(b)\}$

### Briefly on Rust

- Offers memory safety (compile time checks for memory violations).
- Does away with complex programming models (object orientation).
- (Relatively...) Simple API, can feel like writing in an interpreted language.
- Interfaces nicely with other languages, and their libraries. e.g. mature (open source) support for MPI.
- Simple cross platform build system (Cargo).
- 'Zero Cost Abstractions' performance won't suffer for using handy abstractions (map, filter, fold ...).

### Points2Octree - Algorithm

- 1. Apply Morton encoding to points at each processor.
- 2. Perform a parallel sort, and remove duplicate Keys, associate points and Keys. Dominates complexity of algorithm [5].
- 3. Find *coarsest possible* tree that spans the domain defined by the Keys at each processor.
- Find the coarsest node(s) at each processor. Complete the region in between the coarsest node(s) across each processor - known as the blocks.
- Perform some kind of load balancing over block, and redistribute the blocks.
- 6. Split blocks to find final distributed octree.

### Illustration of Blocks

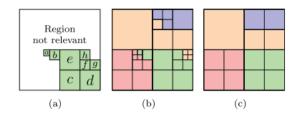


Figure 2: Adapted from [5]

# 2:1 Balancing

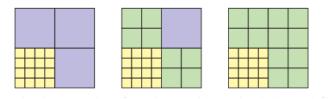


Figure 3: Adapted from [6]

## 2:1: Balancing

Not always strictly necessary (e.g. particle FMM). However, essential to offer functionality in any octree library. Tends to dominate runtime, run as post-processing step.

- 1. E.g. evaluating near interaction in volume (continuous medium) FMM  $\int_{NearField} K(x,y)f(y)$  is computationally expensive (many singular/near singular integrals), balancing allows one to use precomputed tables for valid interactions [1].
- Other numerical schemes may take advantage of it to maximise accuracy while minimising memory footprint [6].

## Options for Balancing

Two major algorithmic approaches to balancing

- 1. (older) Ripple based algorithms [2, 5].
- 2. (newer) Sorting based algorithms [1, 3].

## 2:1 Balancing - (1) Ripple Based

- 1. Each process enforces balance in its subdomain, must communicate with neighbours to resolve conflicts.
- 2. Generally require multiple rounds of communication.
- 3. Algorithmically fairly complex, with no clear advantage of sorting based methods [6].
- 4. Existing OS software: P4EST (C++)
- 5. Won't talk about them further.

## 2:1 Balancing - (2) Sorting Based

- 1. Each process computes a tree over global domain that's suitably balanced with the octants it controls.
- These are then sorted in parallel, and duplicates/overlaps are removed (favouring the smaller octants). Guaranteed to be 2:1 balanced.
- 3. Simple communication pattern (sorting).
- 4. Existing OS software: Dendro (C++)

### 2:1 Balancing - Sequential Algorithm

Example local balancing algorithm (there are numerous approaches):

1. Balance Subroutine

for  $i \leftarrow L_{max}$  to 1 do

- For each octant at this level, find coarsest compatible neighbours, add to output.
- 2. Remove overlaps

for  $i \leftarrow L_{max}$  to 1 do

1. For each octant at this level, remove any ancestors that lie in the tree.

# Choosing a Sorting Algorithm

This is the most important choice, as both building and balancing require a parallel sort, and in both cases will dominate runtime.

# State of the Art - HykSort

First presented in 2013 [4], remains fastest method in 2021 [6].

- 1. Sample Sort contains a global AllToAll communication. This leads to network congestion for larger problems.
- 2. Requires selection (and parallel sorting) of p-1 splitters, where p is the number of processors. Can be expensive for large p.
- 3. HykSort uses a Hypercube style communication pattern, but with k rather than 2 splits for each recursive call, where k < p,  $k\beta$  splitters are chosen.

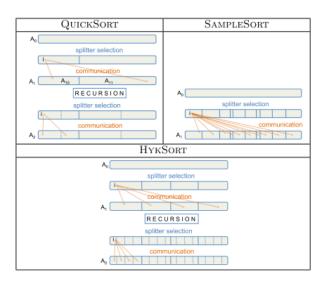


Figure 4: Adapted from [4]

- 1. In [4] they sort 8 trillion 32 bit integers in 37 seconds on 262,144 cores.
- 2. Use OpenMP optimised local sorting algorithm based on merge sort, and SIMD optimised merge operation. Don't report similar benchmark for sorting Morton keys though.

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#### Implementation and Benchmarks

#### 1. Software

#### Available at github.com/skailasa/distributed-trees

- 1. Currently only uses sample sort for parallel sort, and balancing not yet implemented.
- 2. Local sort using Rust's native implementation.
- 3. Fully unit tested.

#### TODO:

- Implement and test HykSort, and whether it matters for our problem sizes.
- Morton keys are represented as vec of structs for clarity, though would be preferable to represent them as a struct of arrays for speed.
- 3. Add balancing algorithm.
- 4. Add API for higher level codes, i.e. easy access to interaction lists etc.
- 5. Measure strong and weak scaling on cluster.



## 2. (Local) Benchmarks

Tested on my 6 core i7 laptop.

- 1. 6e6 randomly distributed particles (1e6 per core), ncrit=150, max depth=7.
- 2. Unbalanced tree with 260688 leaf nodes.
- 3. Runtime: 2.41 seconds. Peak Memory Usage: 1.9 GB.

Interesting comparison, single node C++ implementation in ExaFMM-T, current state of the art, accelerated with OpenMP, for same problem has a runtime of 3.94 seconds with peak memory usage of  $1.6~\mathrm{GB}$ .

#### References I

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