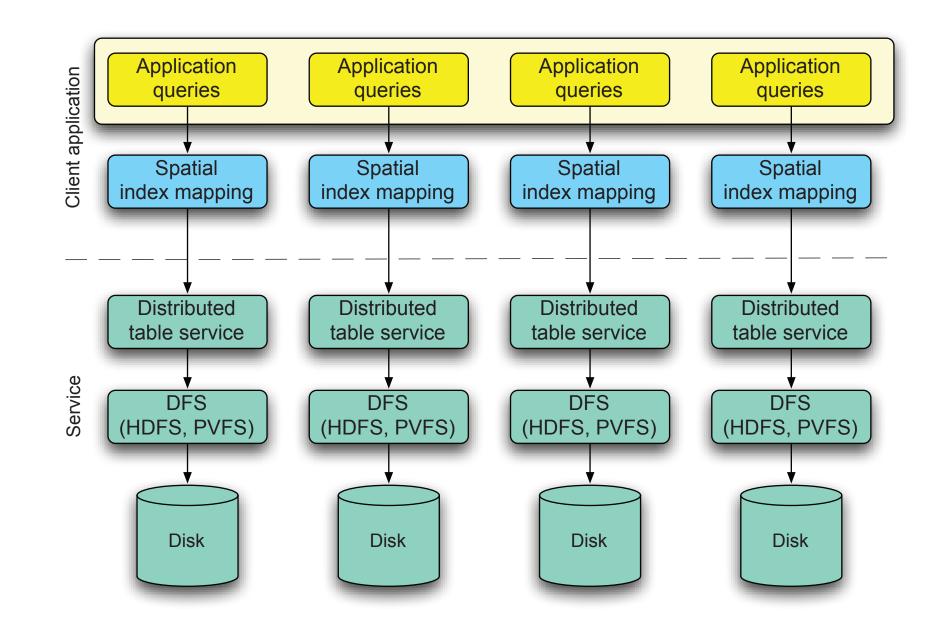
# **Scalable Spatial Indexing for Data-Intensive Science Applications**

Julio López, Bin Fu, Eugene Fink, Garth Gibson

#### Overview

Many data-intensive problems in science rely on spatial data structures to obtain a solution. Our approach is to extend table software, such as HBase, to provide distributed scalable spatial data structures. Our initial implementation linearizes octrees using Morton codes to



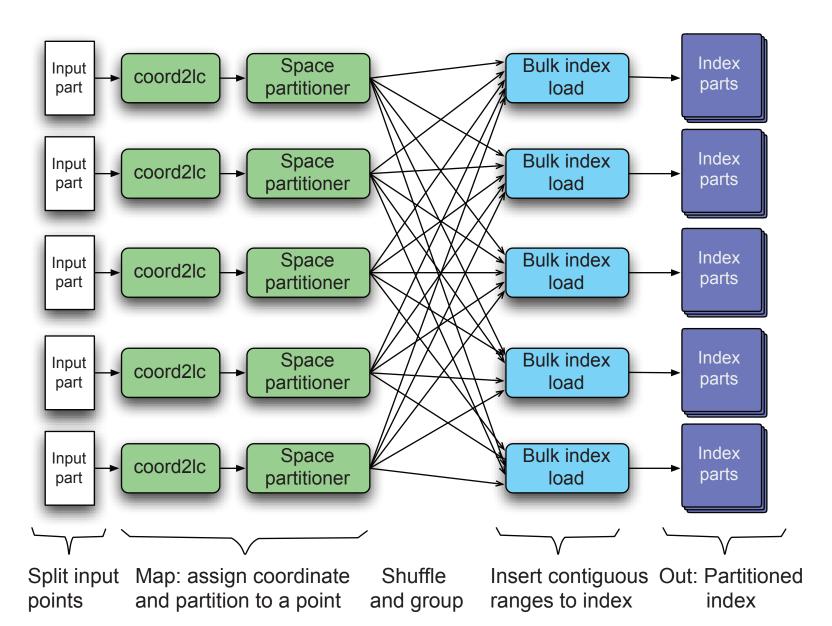
#### create a Z-order fill.

#### Approach

- Input: point records with location and other attributes
- Use an octree to partition and index the records
- Linearize octree and store in a distributed sorted table
  - Key linearization using Morton codes
  - Z-order space filling curve
  - Sorted table: HBase, Cassandra, Hypertable
- Initial implementation as a client-side library
- Tools for bulk-loading index creation

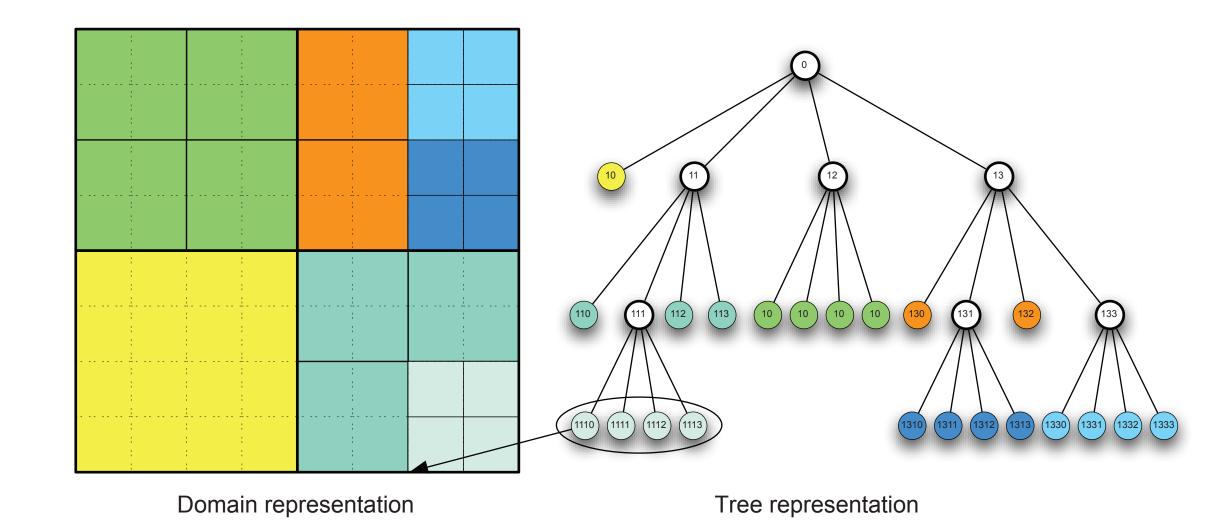
**Decomposition of the space using an octree.** The spatial domain representation (left) has an

#### **Distributed spatial indexing architecture**

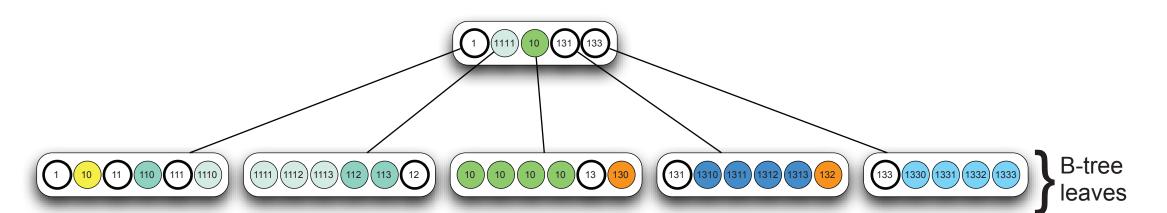


Using Map-Reduce, input points are grouped in spatial buckets and then continuous ranges can be bulk loaded into the index partitions.

equivalent tree representation (right). Nodes in the tree are numbered using a pre-fix scheme equivalent to the pre-order traversal of the tree.



The nodes in the octree are mapped to a sorted array that is indexed with a B-tree.



## Applications

- Astrophysics:
  - Group-finding (galaxy clustering)
  - Correlation functions
  - Domain partitioning
  - Density distribution function
- Seismology
  - 3D ground model datasets for simulation
  - Indexing of 4D wavefields

### **Research Questions**

- Approaches for index construction:
  - A1: Insert unsorted point records
  - A2: Sort first, then partition and bulk load

Octree nodes sorted by pre-order traversal of the tree

- What functionality should be moved to the server?
- New distributed algorithms for data-analytics at scale.
- How can these algorithms leverage the distributed

spatial indices?

