# **Astronomy Application of Map-Reduce: A Distributed Friends-of-Friends Algorithm**

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#### Long-term Goal

We are developing algorithms and software tools for massive astronomical computations on large computer clusters.

#### **Astronomical Datasets**

- Sloan digital sky survey (2000-2008): 230 million objects, 50 TByte
- Pan-STARRS (began in 2009):



## **Initial Results**

We have developed tools for identifying gravitationally bound clusters of galaxies based on the Friends-of-Friends technique:

- Two galaxies are "friends" if they are close to each other; that is, the distance between them is within a specific global threshold
- We analyze an undirected graph, where galaxies are vertices and their "friendships" are edges. We identify the graph's connected components, which serve as an approximation of gravitationally bound clusters

Half-order of magnitude larger than

#### Sloan

• Large Synoptic Survey Telescope (to begin in 2016): Order of magnitude larger than Sloan

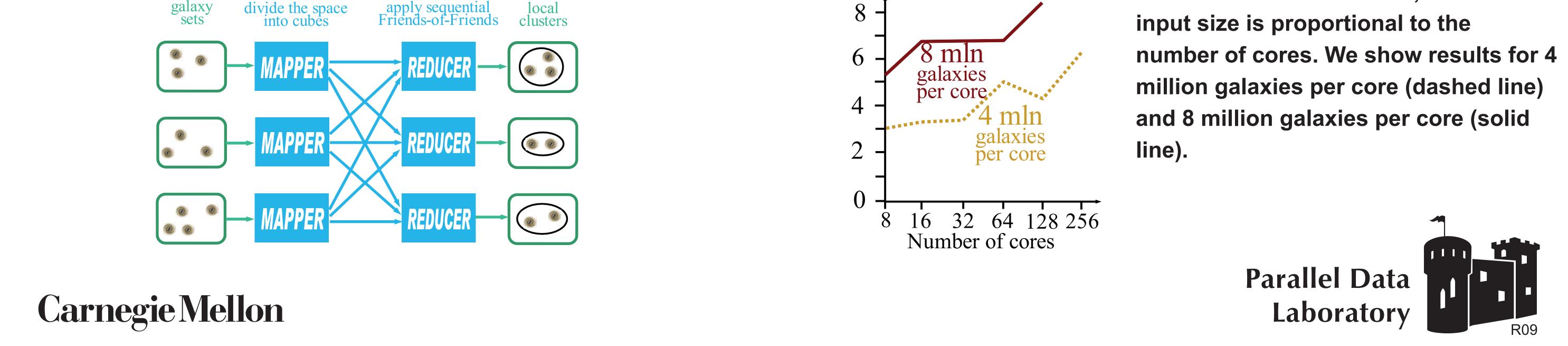
## **Previous Results**

- Researchers have designed fast sequential **Friends-of-Friends algorithms:** 
  - Exact:  $O((n \cdot \log n)^{1.5})$
  - Approximate: O(n)
- These algorithms however do not scale to massive astronomical surveys

## **Distributed Procedure**

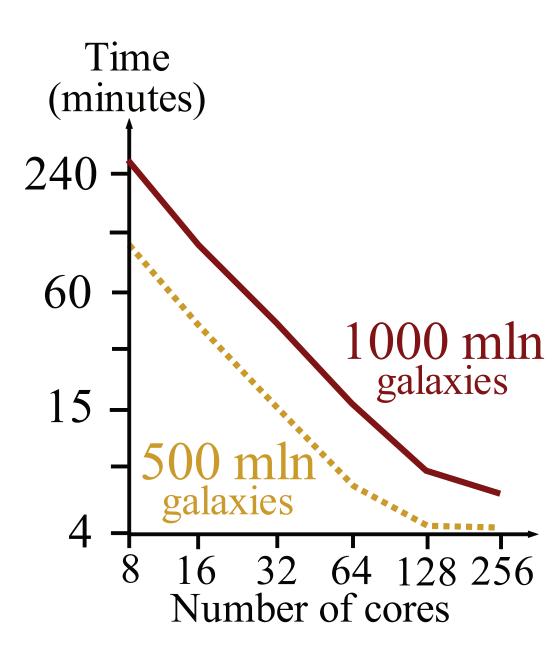
We have developed a Map-Reduce "wrapper" that distributes the Friends-of-Friends computation among multiple cores:

- Divide the space into cubes, where each cube includes about the same number of galaxies, by applying the kd-tree construction to a randomly selected subset of galaxies
- Apply a sequential Friends-of-Friends procedure to find the clusters within each cube
- Identify cross-cube "friendships" and merge the respective clusters, using the union-find algorithm

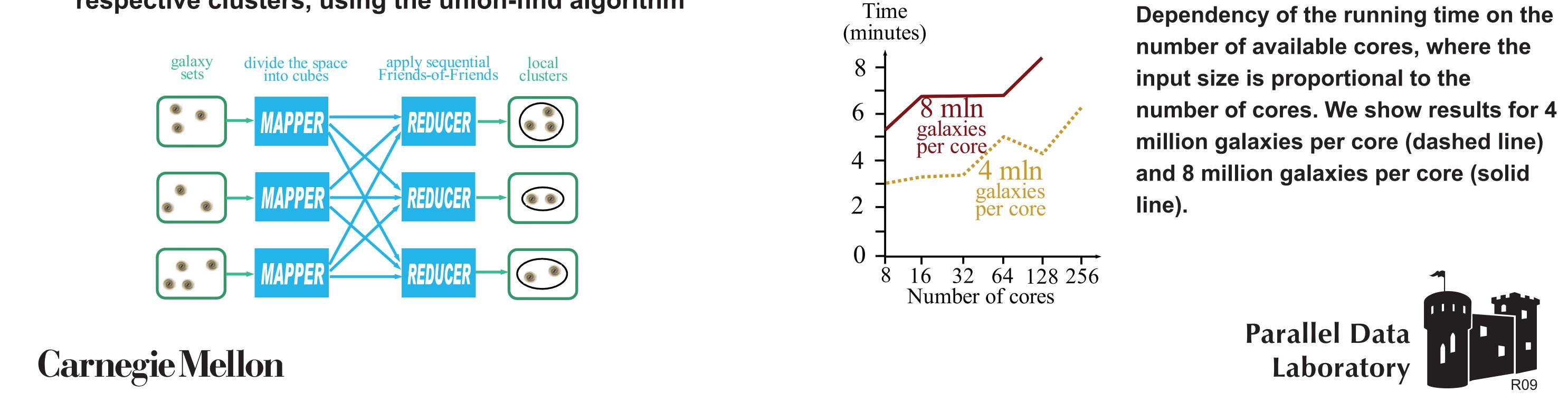


#### Performance

#### **Strong scalability**



#### Weak scalability



**Dependency of the running time on** the number of available cores for 500 million galaxies (dashed line) and 1000 million galaxies (dotted line).