Grid-Based Clustering Methods

- Grid-Based Clustering: Explore multi-resolution grid data structure in clustering
 - Partition the data space into a finite number of cells to form a grid structure
 - ☐ Find clusters (dense regions) from the cells in the grid structure
- □ Features and challenges of a typical grid-based algorithm
 - Efficiency and scalability: # of cells << # of data points</p>
 - Uniformity: Uniform, hard to handle highly irregular data distributions
 - Locality: Limited by predefined cell sizes, borders, and the density threshold
 - Curse of dimensionality: Hard to cluster high-dimensional data
- Methods to be introduced
 - STING (a Statistical Information Grid Approach) (Wang, Yang and Muntz, VLDB'97)
 - CLIQUE (Agrawal, Gehrke, Gunopulos, and Raghavan, SIGMOD'98)
 - Both grid-based and subspace clustering

STING: A Statistical Information Grid Approach

1st layer

(i-1)at layer

- STING (Statistical Information Grid) (Wang, Yang and Muntz, VLDB'97)
- The spatial area is divided into rectangular cells at different levels of resolution, and these cells form a tree structure
- A cell at a high level contains a number of smaller cells of the next lower level
- Statistical information of each cell is calculated and stored beforehand and is used to answer queries
- Parameters of higher level cells can be easily calculated from that of lower level cell, including
 - count, mean, s(standard deviation), min, max
 - type of distribution—normal, uniform, etc.

Query Processing in STING and Its Analysis

- To process a region query
 - Start at the root and proceed to the next lower level, using the STING index
 - Calculate the likelihood that a cell is relevant to the query at some confidence level using the statistical information of the cell
 - Only children of likely relevant cells are recursively explored
 - Repeat this process until the bottom layer is reached
- Advantages
 - Query-independent, easy to parallelize, incremental update
 - Efficiency: Complexity is O(K)
 - K: # of grid cells at the lowest level, and K << N (i.e., # of data points)</p>

CLIQUE: Grid-Based Subspace Clustering

- CLIQUE (Clustering In QUEst) (Agrawal, Gehrke, Gunopulos, Raghavan: SIGMOD'98)
- CLIQUE is a density-based and grid-based subspace clustering algorithm
 - Grid-based: It discretizes the data space through a grid and estimates the density by counting the number of points in a grid cell
 - Density-based: A cluster is a maximal set of connected dense units in a subspace
 - A unit is dense if the fraction of total data points contained in the unit exceeds the input model parameter
 - Subspace clustering: A subspace cluster is a set of neighboring dense cells in an arbitrary subspace. It also discovers some minimal descriptions of the clusters