

Typical Clustering Methodologies (I)

Distance-based methods
Partitioning algorithms: K-Means, K-Medians, K-Medoids (づる)
□ Hierarchical algorithms: Agglomerative vs. divisive methods (分似)
□ Density-based and grid-based methods down to the books
Density-based: Data space is explored at a high-level of granularity and then post-processing to put together dense regions into an arbitrary shape
Grid-based: Individual regions of the data space are formed into a grid-like structure
Probabilistic and generative models: Modeling data from a generative process
Assume a specific form of the generative model (e.g., mixture of Gaussians)
Model parameters are estimated with the Expectation-Maximization (EM) algorithm (using the available dataset, for a maximum likelihood fit)
Then estimate the generative probability of the underlying data points

Typical Clustering Methodologies (II)

High-dimensional clustering

- Subspace clustering: Find clusters on various subspaces
 - \square Bottom-up, top-down, correlation-based methods vs. δ -cluster methods
- Dimensionality reduction: A vertical form (i.e., columns) of clustering
 - Columns are clustered; may cluster rows and columns together (co-clustering)
 - Probabilistic latent semantic indexing (PLSI) then LDA: Topic modeling of text data
 - A cluster (i.e., topic) is associated with a set of words (i.e., dimensions) and a set of documents (i.e., rows) simultaneously
 - Nonnegative matrix factorization (NMF) (as one kind of co-clustering)
 - ☐ A nonnegative matrix A (e.g., word frequencies in documents) can be approximately factorized two non-negative low rank matrices U and V
 - Spectral clustering: Use the spectrum of the similarity matrix of the data to perform dimensionality reduction for clustering in fewer dimensions

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