Density-Based Clustering

- **Clustering based on density** (local cluster criterion), such as densityconnected points
 - Major features:
 - Discover clusters of arbitrary shape
 - o Handle noise
 - \circ One scan
 - Need density parameters as termination condition

• Representative algorithms:

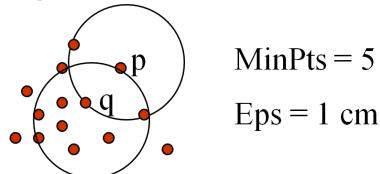
- o <u>DBSCAN</u> (Ester et al., 1996)
- o <u>DENCLUE</u> (Hinneburg & Keim, 1998)

• Clustering Parameters:

- o Eps: Maximum radius of neighborhood
- *MinPts*: Minimum number of points in an Eps-neighborhood of a point
- $\circ N_{Eps}(p) = \{q \in D \mid dist(p,q) \leq Eps\}$

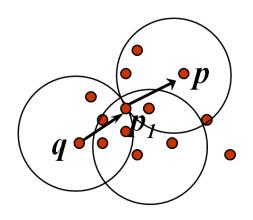
• Directly density-reachable:

- A point *p* is directly density-reachable from a point *q* wrt. *Eps*, *MinPts* iff
 - 1) p belongs to $N_{Eps}(q)$
 - 2) *q* is a core point:
 - $|N_{Eps}(q)| \ge MinPts$



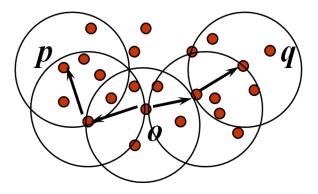
• Density-reachable:

• A point *p* is density-reachable from a point *q* wrt. *Eps*, *MinPts* if there is a chain of points $p_1, ..., p_n, p_1 = q, p_n = p$ such that p_{i+1} is directly density-reachable from p_i

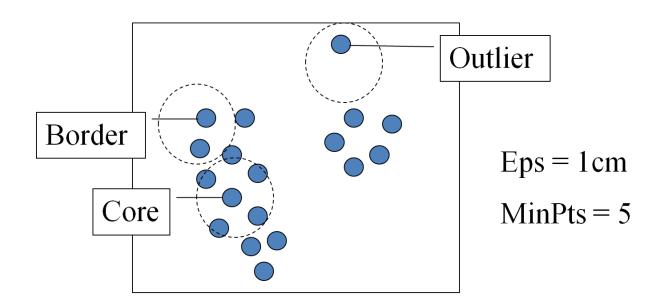


• Density-connected

 A point p is density-connected to a point q wrt. Eps, MinPts if there is a point o such that both, p and q are density-reachable from o wrt. Eps and MinPts.



- Relies on a *density-based* notion of cluster: A *cluster* is defined as a maximal set of density-connected points
- Discovers clusters of arbitrary shape in spatial databases with noise



• DBSCAN: The Algorithm

- \circ Arbitrarily select a point p
- Retrieve all points density-reachable from *p* wrt *Eps* and *MinPts*.
- \circ If p is a core point, a cluster is formed.
- \circ If p is a border point, no points are density-reachable from p and DBSCAN visits the next point of the database.
- \circ Continue the process until all of the points have been processed.