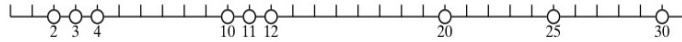
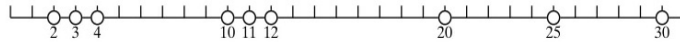
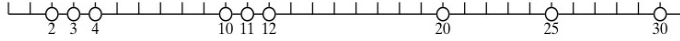
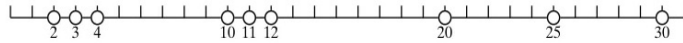


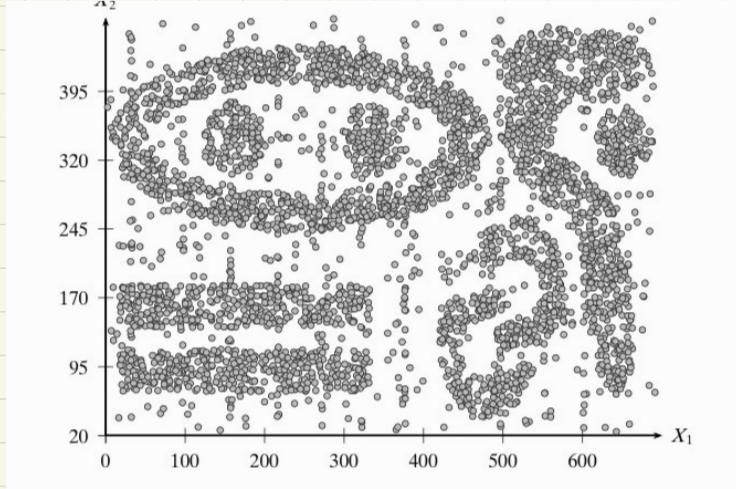
DBSCAN

Clustering So Far

K-means



Even More Complex



Defs

Given Dataset D

Let $\epsilon > 0$ $x \in \mathbb{R}^d$

ϵ -neighbor hood of x

$$N_{\epsilon}(x) = \{y \in D : \|y - x\| \leq \epsilon\}$$

Given param $\text{minpts} \in \mathbb{Z}^+$

Example $\text{minpts} = 6$

For any $x \in D$

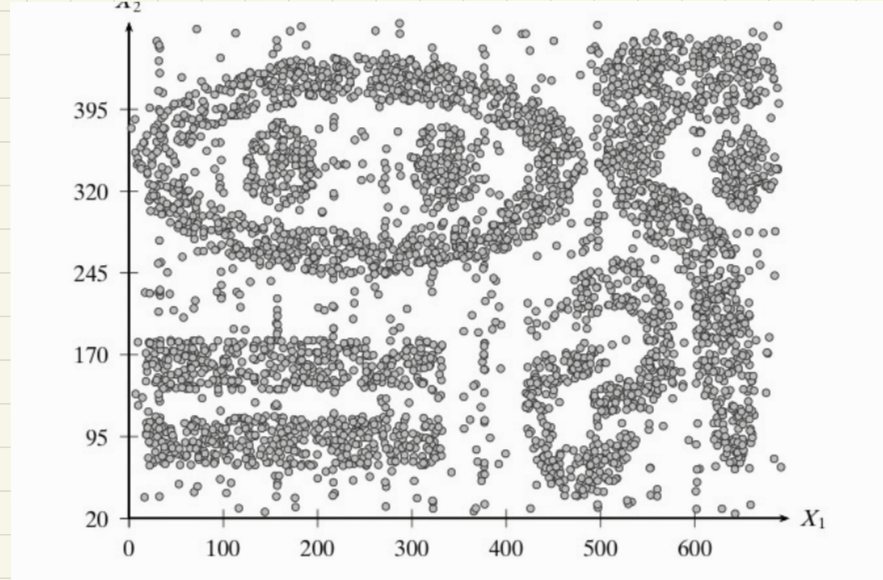
x is a **core point** if
there are at least
 minpts in its ϵ -neighborhood

x is a **border point** if
not a core pt and in
 ϵ -neighborhood of core pt

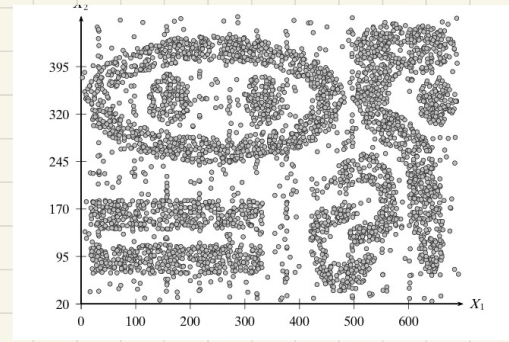
x is noise if !border & !core

DBSCAN algo (high level)

1. $\forall x \in D$
 - compute $N_\epsilon(x)$
 - check if core pt
2. $\forall x \in \text{Core Points}$
 - recursively find all "density connected" points

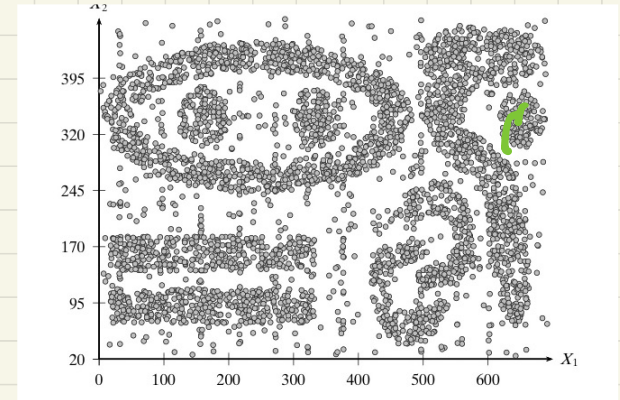


Pseudo Code (Find Corepts)



Pseudo code (find clusters)

h



Pseudo code (Density Connected)

Full Pseudocode

Algorithm 15.1: Density-based Clustering Algorithm

DBSCAN ($\mathbf{D}, \epsilon, minpts$):

```
1  $Core \leftarrow \emptyset$ 
2 foreach  $\mathbf{x}_i \in \mathbf{D}$  do // Find the core points
3   Compute  $N_\epsilon(\mathbf{x}_i)$ 
4    $id(\mathbf{x}_i) \leftarrow \emptyset$  // cluster id for  $\mathbf{x}_i$ 
5   if  $N_\epsilon(\mathbf{x}_i) \geq minpts$  then  $Core \leftarrow Core \cup \{\mathbf{x}_i\}$ 
6  $k \leftarrow 0$  // cluster id
7 foreach  $\mathbf{x}_i \in Core$ , such that  $id(\mathbf{x}_i) = \emptyset$  do
8    $k \leftarrow k + 1$ 
9    $id(\mathbf{x}_i) \leftarrow k$  // assign  $\mathbf{x}_i$  to cluster id  $k$ 
10   $DENSITYCONNECTED(\mathbf{x}_i, k)$ 
11  $\mathcal{C} \leftarrow \{C_i\}_{i=1}^k$ , where  $C_i \leftarrow \{\mathbf{x} \in \mathbf{D} \mid id(\mathbf{x}) = i\}$ 
12  $Noise \leftarrow \{\mathbf{x} \in \mathbf{D} \mid id(\mathbf{x}) = \emptyset\}$ 
13  $Border \leftarrow \mathbf{D} \setminus \{Core \cup Noise\}$ 
14 return  $\mathcal{C}, Core, Border, Noise$ 
```

DENSITYCONNECTED (\mathbf{x}, k):

```
15 foreach  $\mathbf{y} \in N_\epsilon(\mathbf{x})$  do
16    $id(\mathbf{y}) \leftarrow k$  // assign  $\mathbf{y}$  to cluster id  $k$ 
17   if  $\mathbf{y} \in Core$  then  $DENSITYCONNECTED(\mathbf{y}, k)$ 
```
