

Data Mining
TutorialE. Schubert,
A. Zimek**Aufgabe 4-1**single-link
average-link
complete-link**Aufgabe 4-2**DBSCAN und
Single-Link**Aufgabe 4-3** $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich

Data Mining Tutorial

Clusteranalyse – Teil III

Erich Schubert, Arthur Zimek

Ludwig-Maximilians-Universität München

2014-05-16 — KDD Übung

Single-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link

average-link
complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

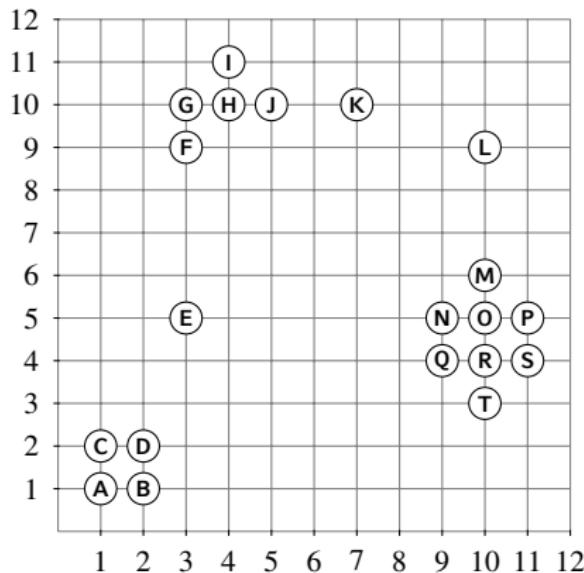
Aufgabe 4-3

$\varepsilon = 5$,
minPts = 2

$\varepsilon = 5$,
minPts = 4

$\varepsilon = 2$,
minPts = 4

Vergleich



A B C D E F G H J I K L M O N P Q S R T

Single-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link

average-link

complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

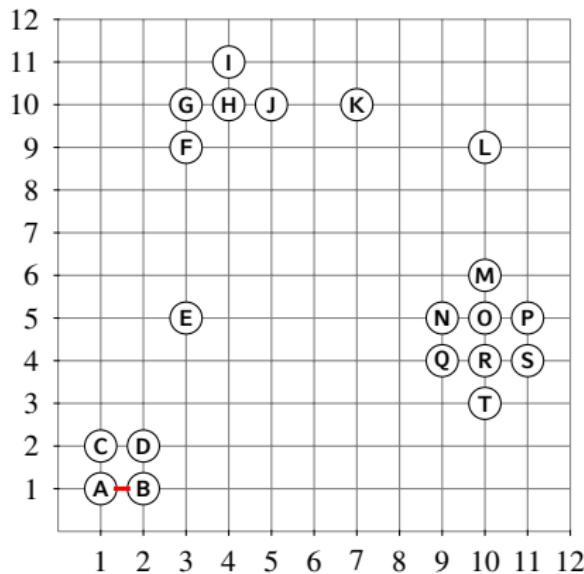
Aufgabe 4-3

$\varepsilon = 5$,
minPts = 2

$\varepsilon = 5$,
minPts = 4

$\varepsilon = 2$,
minPts = 4

Vergleich



Single-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link

average-link

complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

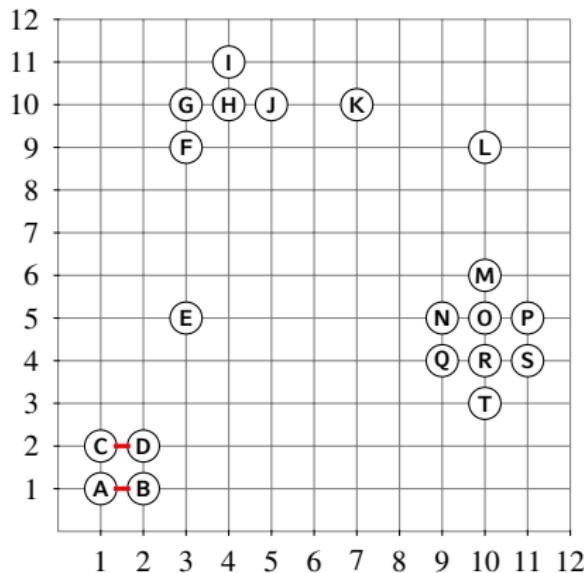
Aufgabe 4-3

$\varepsilon = 5$,
minPts = 2

$\varepsilon = 5$,
minPts = 4

$\varepsilon = 2$,
minPts = 4

Vergleich



Single-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link

average-link
complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

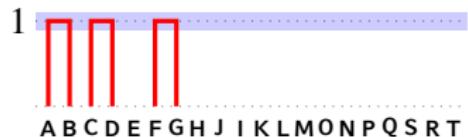
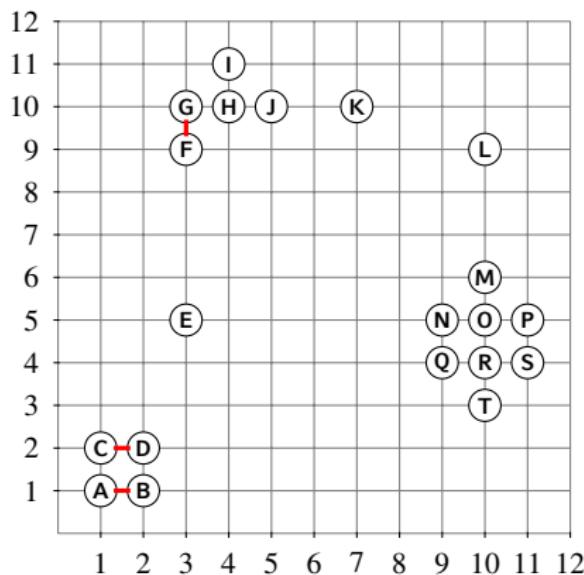
Aufgabe 4-3

$\varepsilon = 5$,
minPts = 2

$\varepsilon = 5$,
minPts = 4

$\varepsilon = 2$,
minPts = 4

Vergleich



Single-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link

average-link
complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

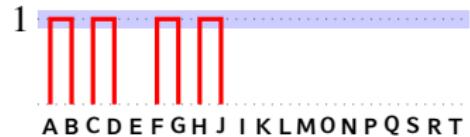
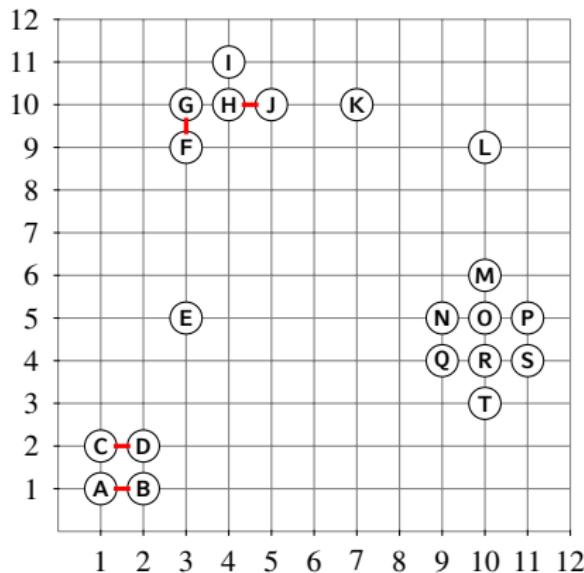
Aufgabe 4-3

$\varepsilon = 5$,
minPts = 2

$\varepsilon = 5$,
minPts = 4

$\varepsilon = 2$,
minPts = 4

Vergleich



Single-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link

average-link
complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

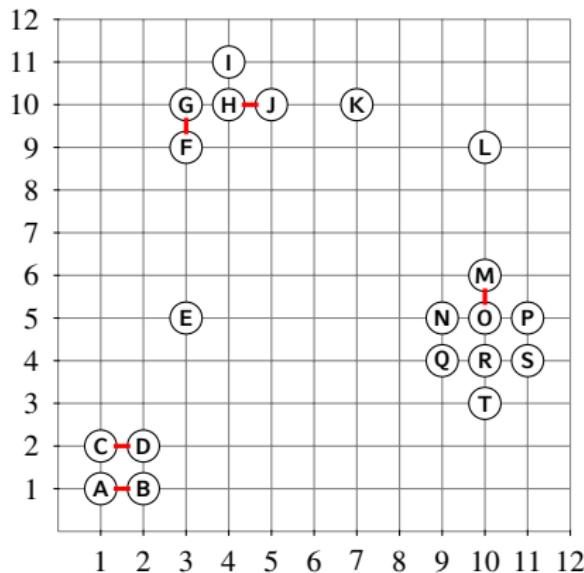
Aufgabe 4-3

$\varepsilon = 5$,
minPts = 2

$\varepsilon = 5$,
minPts = 4

$\varepsilon = 2$,
minPts = 4

Vergleich



Single-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link

average-link

complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

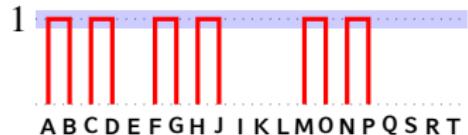
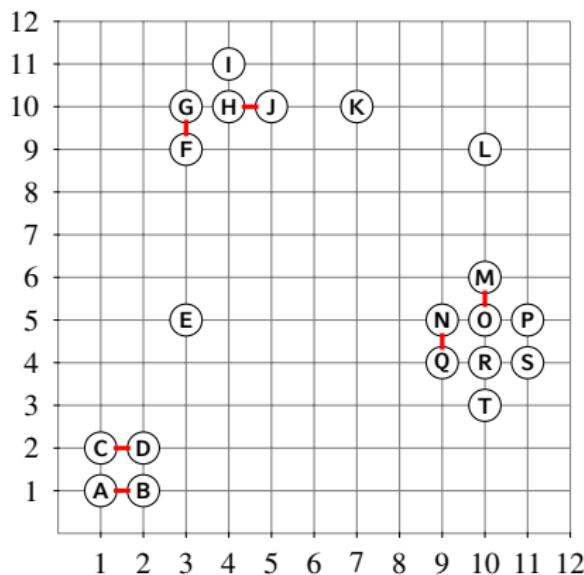
Aufgabe 4-3

$\varepsilon = 5$,
minPts = 2

$\varepsilon = 5$,
minPts = 4

$\varepsilon = 2$,
minPts = 4

Vergleich



Single-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link

average-link

complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

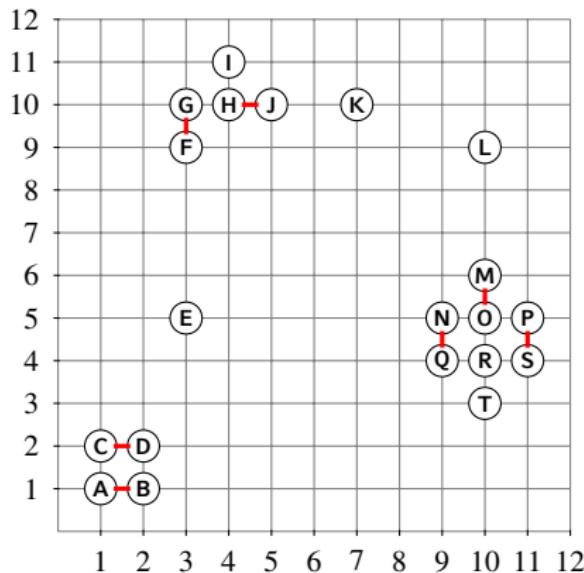
Aufgabe 4-3

$\varepsilon = 5$,
minPts = 2

$\varepsilon = 5$,
minPts = 4

$\varepsilon = 2$,
minPts = 4

Vergleich



Single-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link

average-link

complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

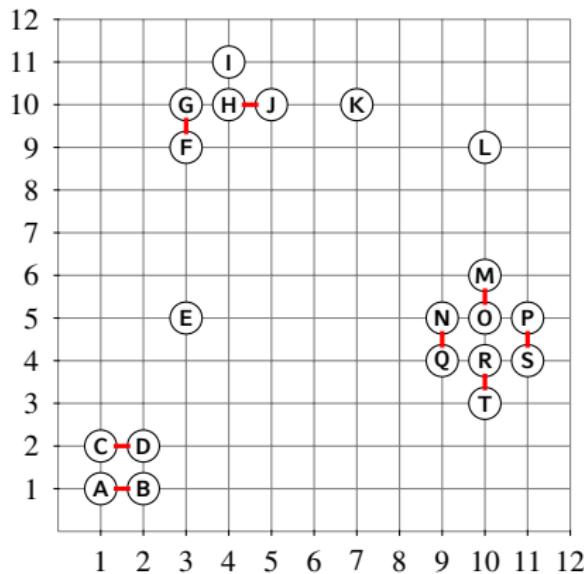
Aufgabe 4-3

$\varepsilon = 5$,
minPts = 2

$\varepsilon = 5$,
minPts = 4

$\varepsilon = 2$,
minPts = 4

Vergleich



Single-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link

average-link

complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

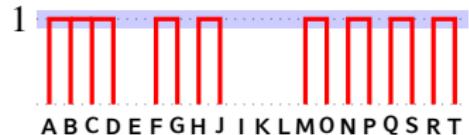
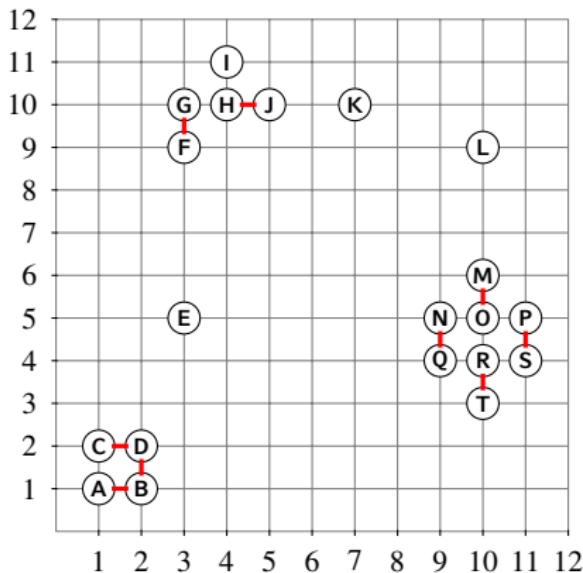
Aufgabe 4-3

$\varepsilon = 5$,
minPts = 2

$\varepsilon = 5$,
minPts = 4

$\varepsilon = 2$,
minPts = 4

Vergleich



Single-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link

average-link

complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

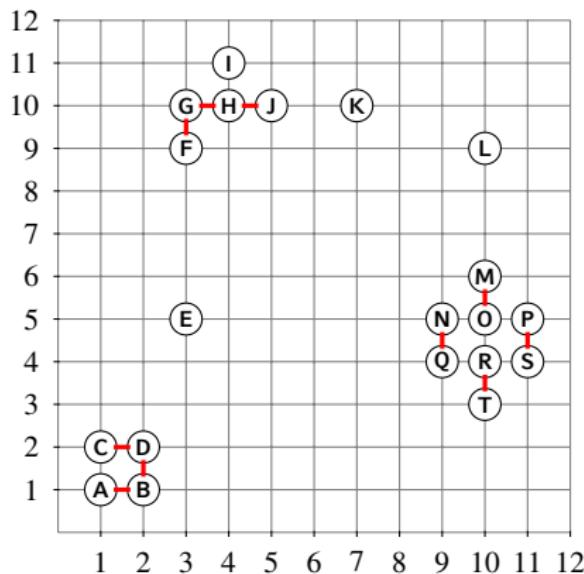
Aufgabe 4-3

$\varepsilon = 5$,
minPts = 2

$\varepsilon = 5$,
minPts = 4

$\varepsilon = 2$,
minPts = 4

Vergleich



Single-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link

average-link

complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

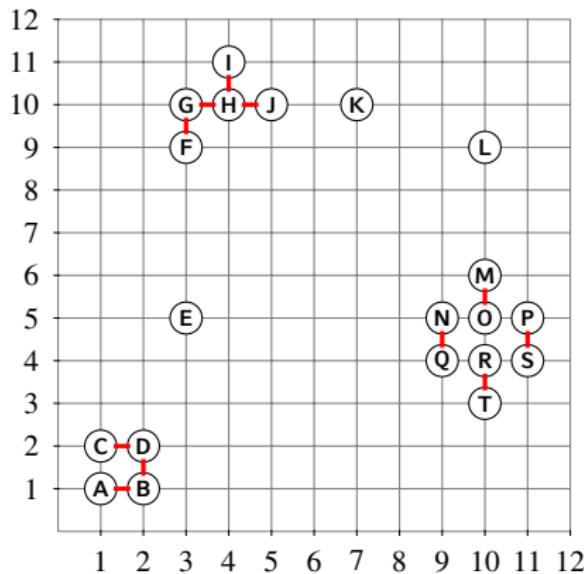
Aufgabe 4-3

$\varepsilon = 5$,
minPts = 2

$\varepsilon = 5$,
minPts = 4

$\varepsilon = 2$,
minPts = 4

Vergleich



Single-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link

average-link
complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

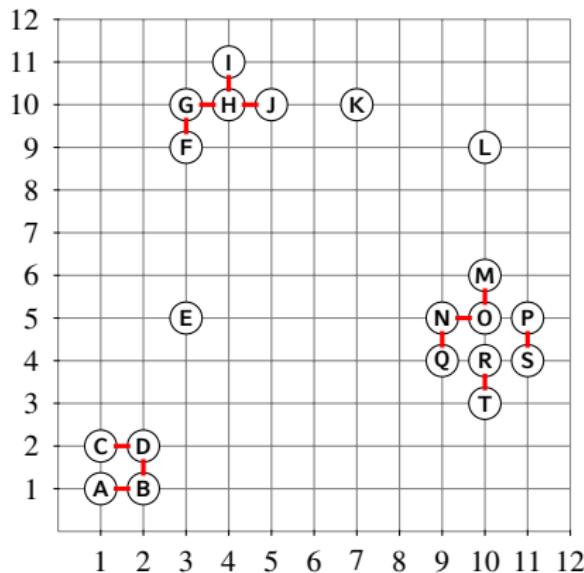
Aufgabe 4-3

$\varepsilon = 5$,
minPts = 2

$\varepsilon = 5$,
minPts = 4

$\varepsilon = 2$,
minPts = 4

Vergleich



Single-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link

average-link
complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

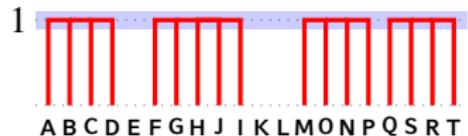
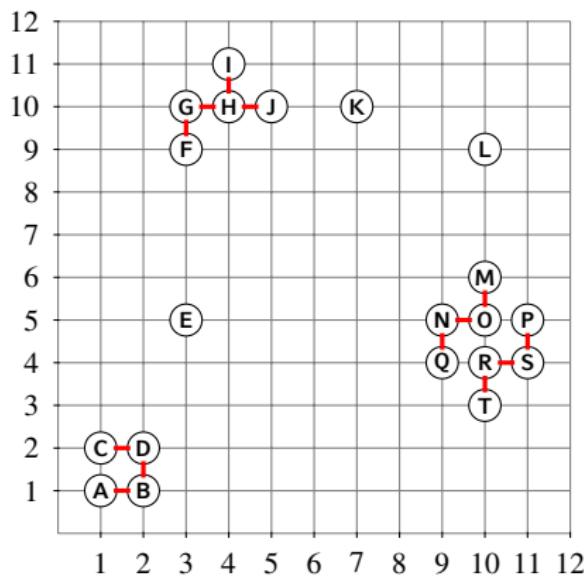
Aufgabe 4-3

$\varepsilon = 5$,
minPts = 2

$\varepsilon = 5$,
minPts = 4

$\varepsilon = 2$,
minPts = 4

Vergleich



Single-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link

average-link

complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

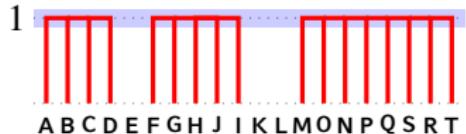
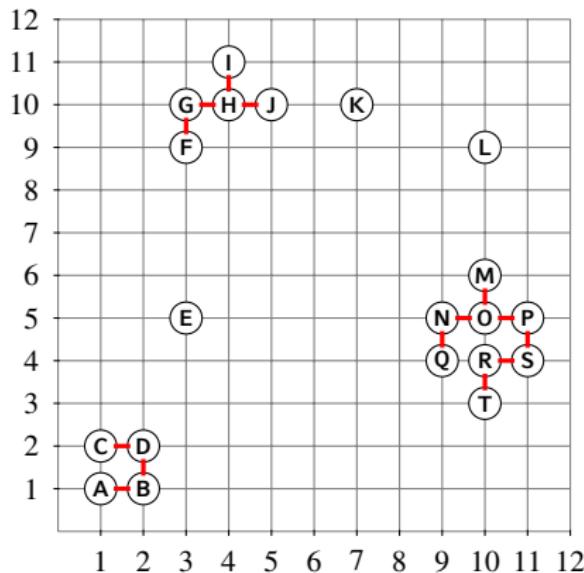
Aufgabe 4-3

$\varepsilon = 5$,
minPts = 2

$\varepsilon = 5$,
minPts = 4

$\varepsilon = 2$,
minPts = 4

Vergleich



Single-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link

average-link

complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

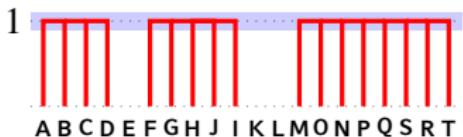
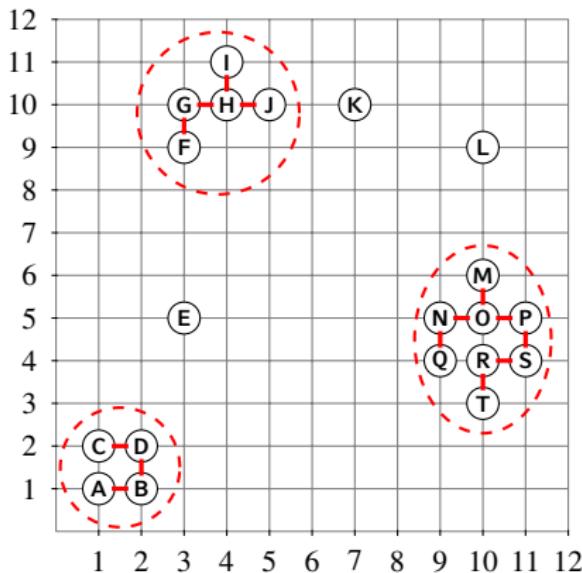
Aufgabe 4-3

$\varepsilon = 5$,
minPts = 2

$\varepsilon = 5$,
minPts = 4

$\varepsilon = 2$,
minPts = 4

Vergleich



Single-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link

average-link

complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

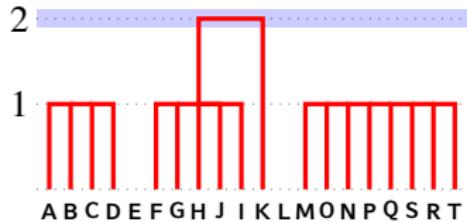
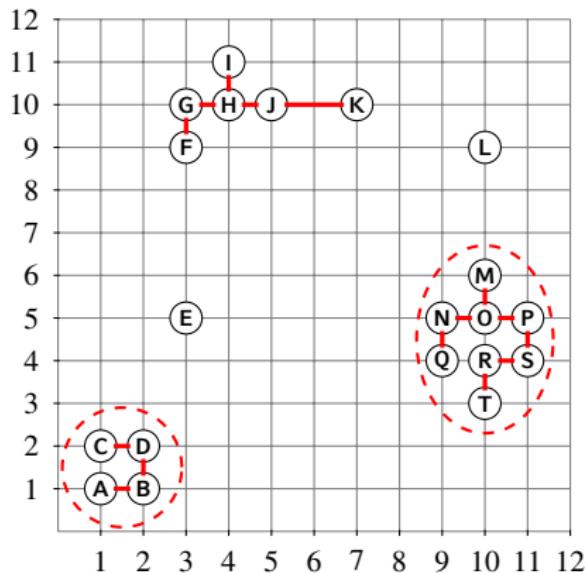
Aufgabe 4-3

$\varepsilon = 5$,
minPts = 2

$\varepsilon = 5$,
minPts = 4

$\varepsilon = 2$,
minPts = 4

Vergleich



Single-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link

average-link

complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

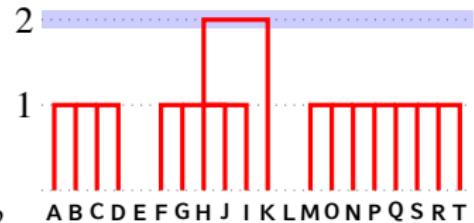
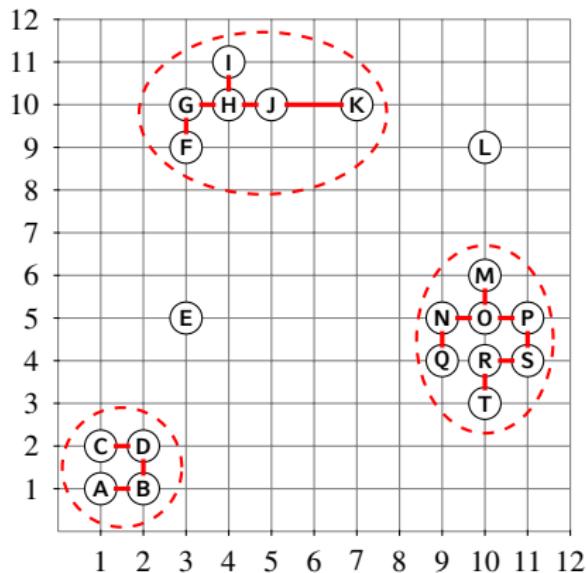
Aufgabe 4-3

$\varepsilon = 5$,
minPts = 2

$\varepsilon = 5$,
minPts = 4

$\varepsilon = 2$,
minPts = 4

Vergleich



Single-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link

average-link
complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

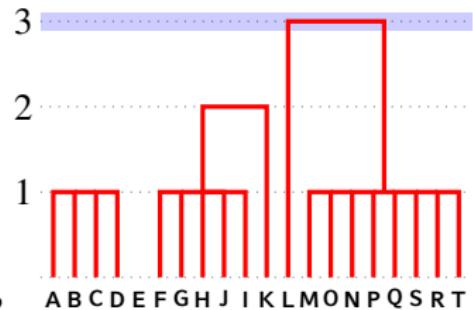
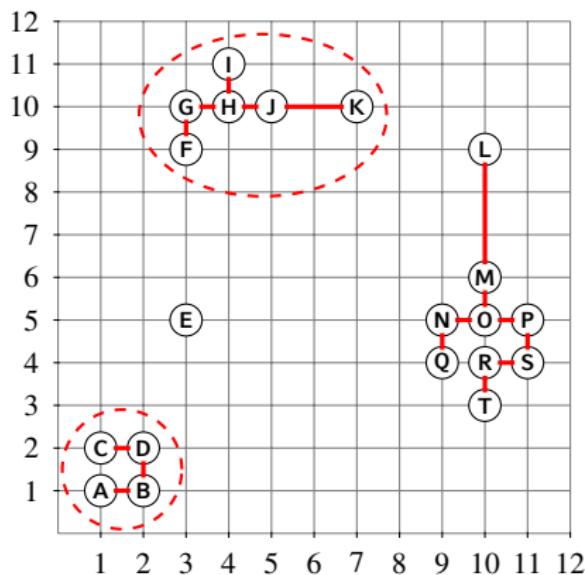
Aufgabe 4-3

$\varepsilon = 5$,
minPts = 2

$\varepsilon = 5$,
minPts = 4

$\varepsilon = 2$,
minPts = 4

Vergleich



Single-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link

average-link
complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

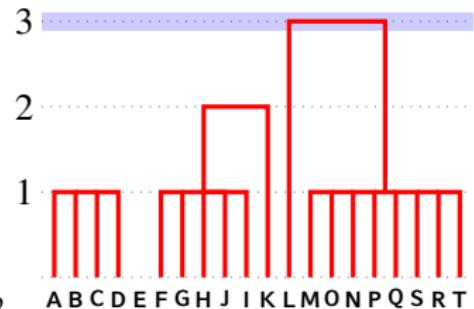
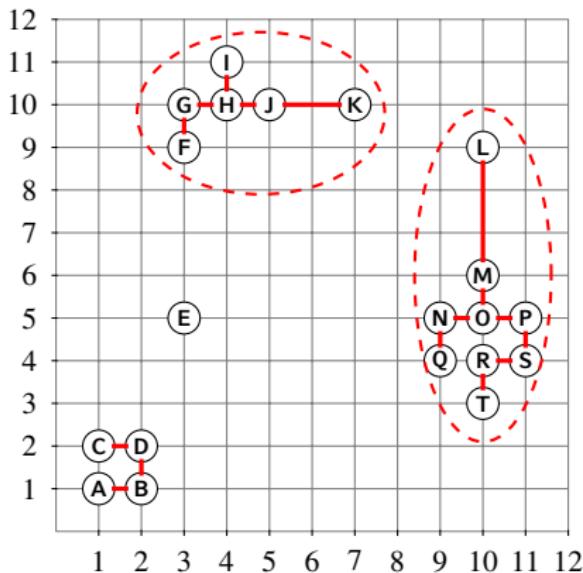
Aufgabe 4-3

$\varepsilon = 5$,
minPts = 2

$\varepsilon = 5$,
minPts = 4

$\varepsilon = 2$,
minPts = 4

Vergleich



Single-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link

average-link
complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

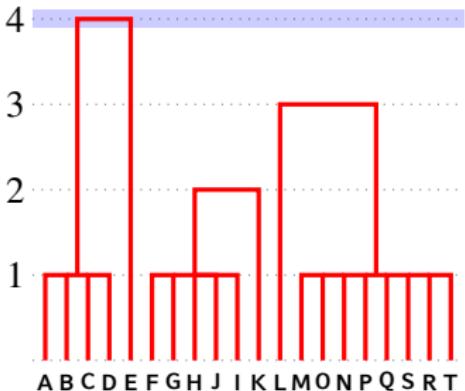
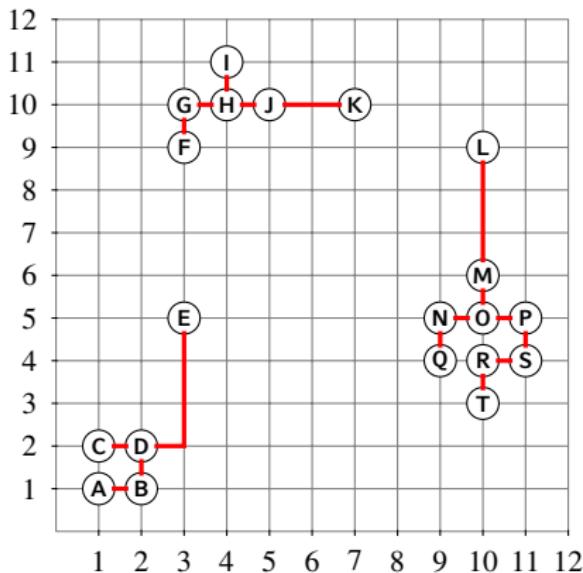
Aufgabe 4-3

$\varepsilon = 5$,
minPts = 2

$\varepsilon = 5$,
minPts = 4

$\varepsilon = 2$,
minPts = 4

Vergleich



Single-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link

average-link

complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

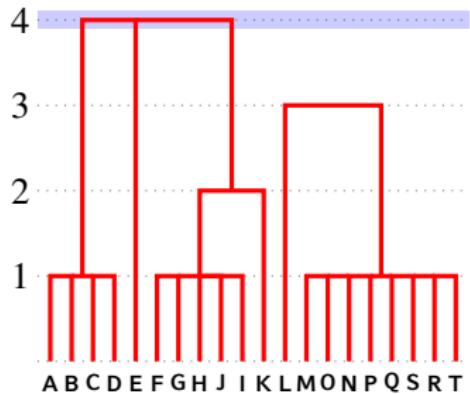
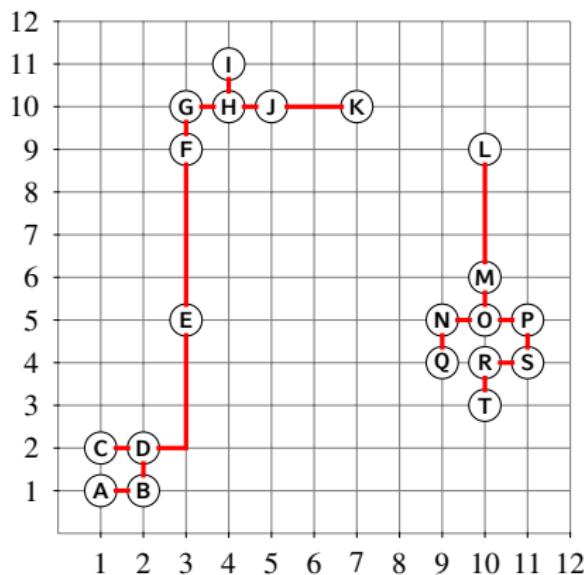
Aufgabe 4-3

$\varepsilon = 5$,
minPts = 2

$\varepsilon = 5$,
minPts = 4

$\varepsilon = 2$,
minPts = 4

Vergleich



Single-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link

average-link
complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

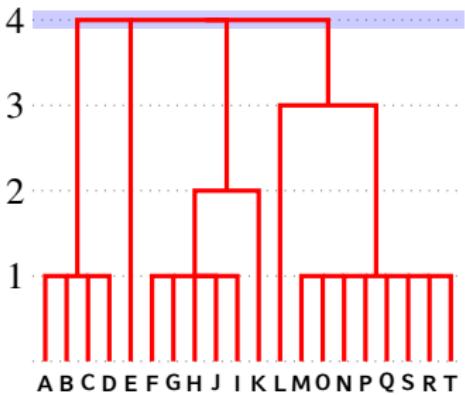
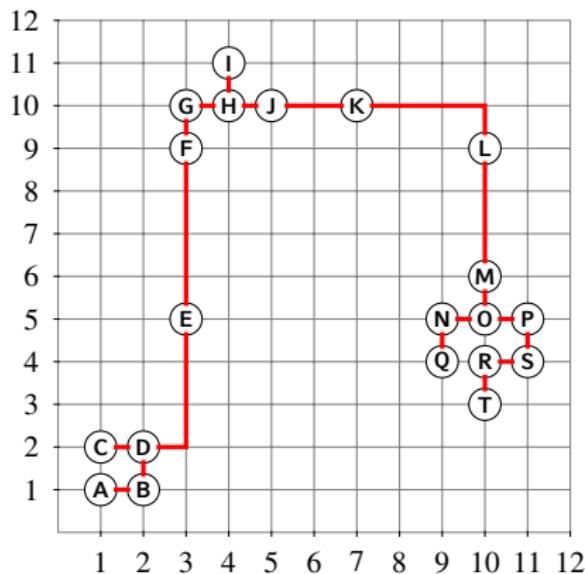
Aufgabe 4-3

$\varepsilon = 5$,
minPts = 2

$\varepsilon = 5$,
minPts = 4

$\varepsilon = 2$,
minPts = 4

Vergleich



Group-Average-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link

average-link

complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

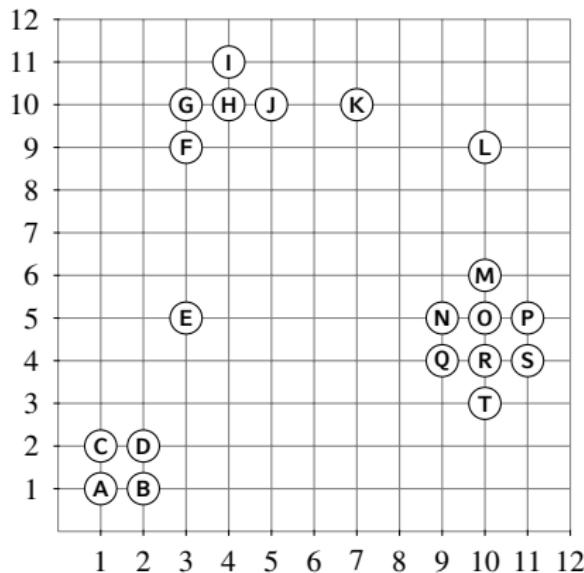
Aufgabe 4-3

$\varepsilon = 5$,
minPts = 2

$\varepsilon = 5$,
minPts = 4

$\varepsilon = 2$,
minPts = 4

Vergleich



A B C D E F G H J I K L M O N P Q S R T

Group-Average-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link

average-link

complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

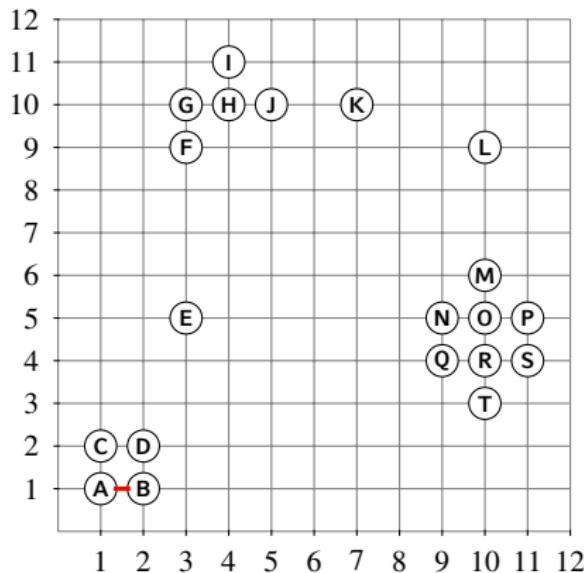
Aufgabe 4-3

$\varepsilon = 5$,
minPts = 2

$\varepsilon = 5$,
minPts = 4

$\varepsilon = 2$,
minPts = 4

Vergleich



Group-Average-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link

average-link

complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

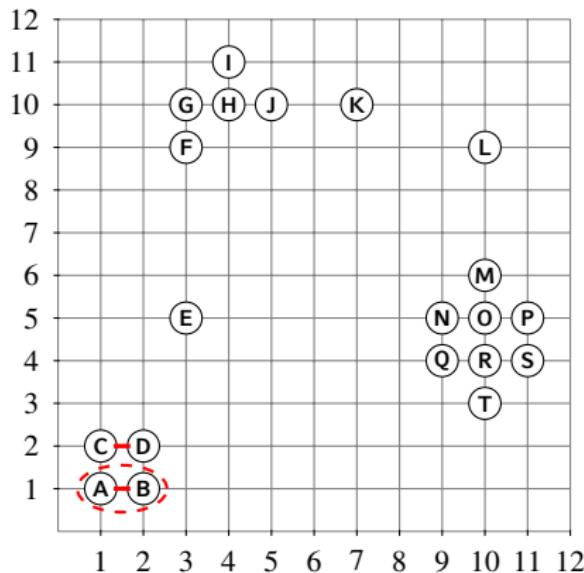
Aufgabe 4-3

$\varepsilon = 5$,
minPts = 2

$\varepsilon = 5$,
minPts = 4

$\varepsilon = 2$,
minPts = 4

Vergleich



Group-Average-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link

average-link

complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

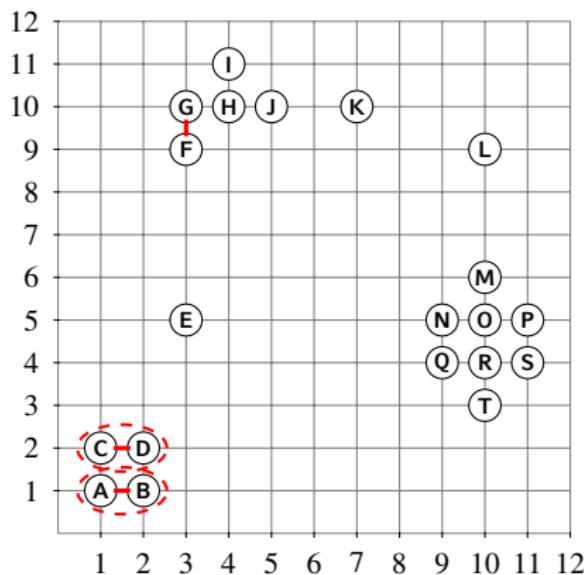
Aufgabe 4-3

$\varepsilon = 5$,
minPts = 2

$\varepsilon = 5$,
minPts = 4

$\varepsilon = 2$,
minPts = 4

Vergleich



Group-Average-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link

average-link

complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

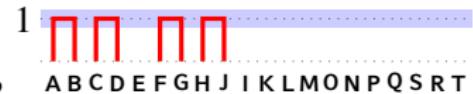
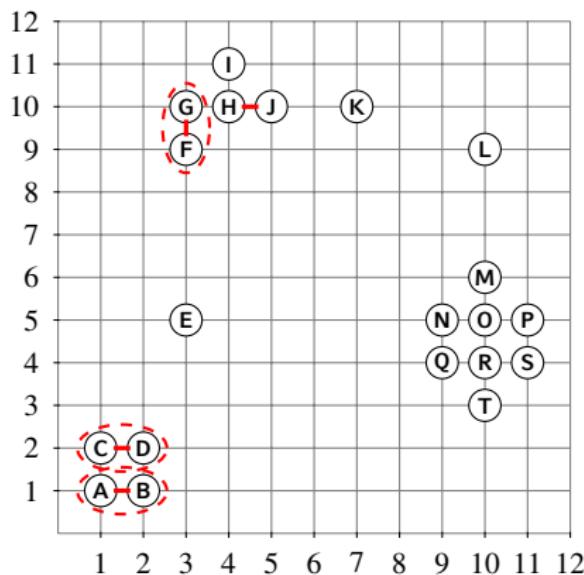
Aufgabe 4-3

$\varepsilon = 5$,
minPts = 2

$\varepsilon = 5$,
minPts = 4

$\varepsilon = 2$,
minPts = 4

Vergleich



Group-Average-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link

average-link

complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

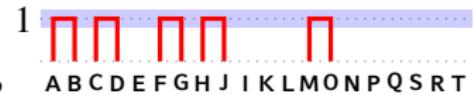
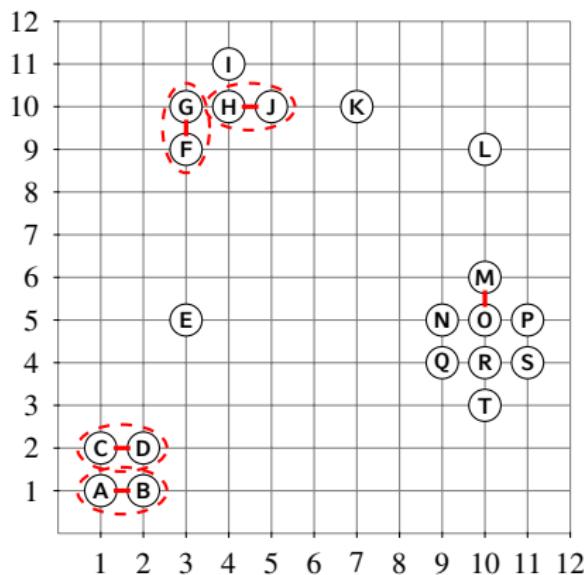
Aufgabe 4-3

$\varepsilon = 5$,
minPts = 2

$\varepsilon = 5$,
minPts = 4

$\varepsilon = 2$,
minPts = 4

Vergleich



Group-Average-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link

average-link

complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

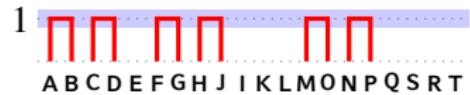
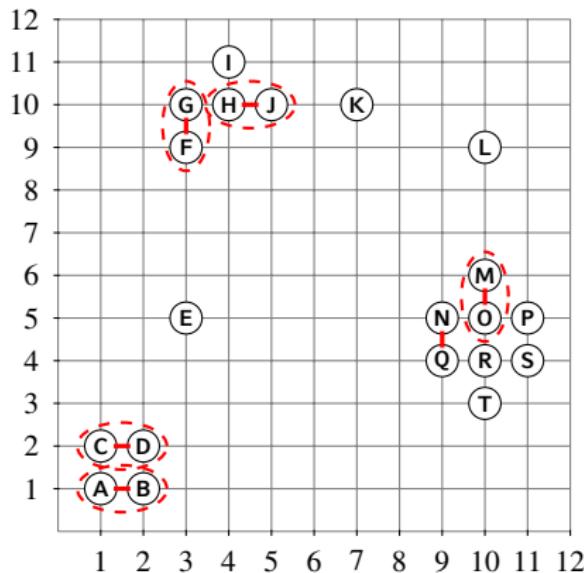
Aufgabe 4-3

$\varepsilon = 5$,
minPts = 2

$\varepsilon = 5$,
minPts = 4

$\varepsilon = 2$,
minPts = 4

Vergleich



Group-Average-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link

average-link

complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

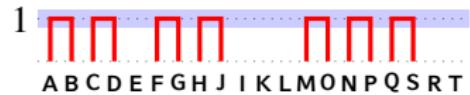
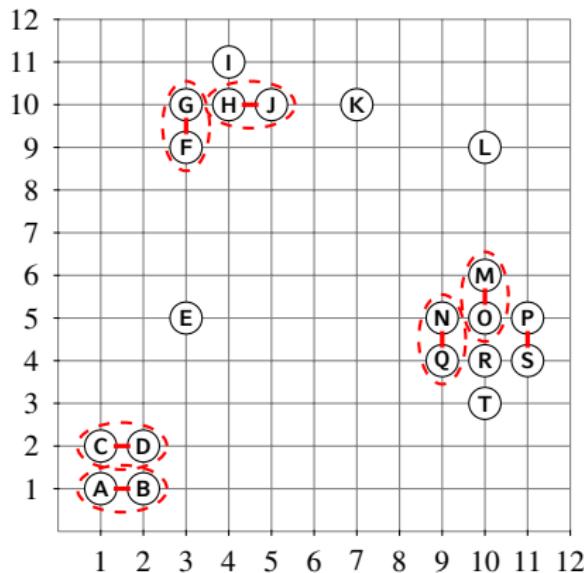
Aufgabe 4-3

$\varepsilon = 5$,
minPts = 2

$\varepsilon = 5$,
minPts = 4

$\varepsilon = 2$,
minPts = 4

Vergleich



Group-Average-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link

average-link

complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

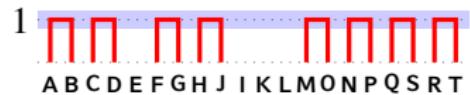
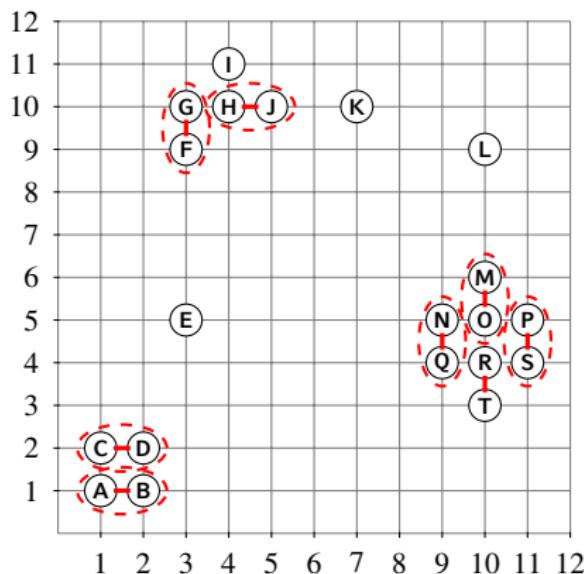
Aufgabe 4-3

$\varepsilon = 5$,
minPts = 2

$\varepsilon = 5$,
minPts = 4

$\varepsilon = 2$,
minPts = 4

Vergleich



Group-Average-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link

average-link

complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

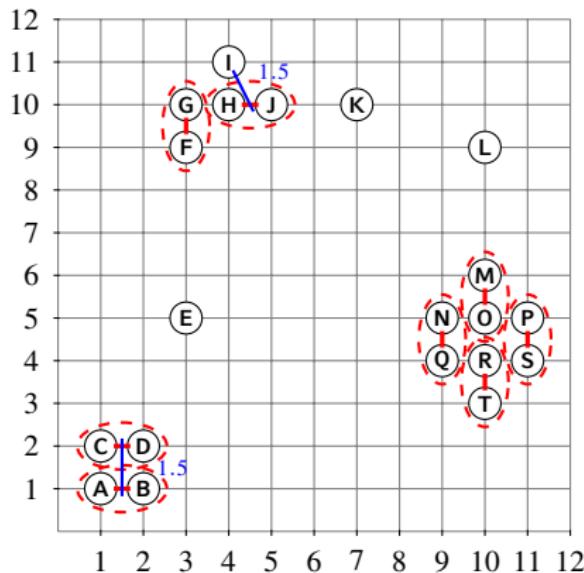
Aufgabe 4-3

$\varepsilon = 5$,
 $\text{minPts} = 2$

$\varepsilon = 5$,
 $\text{minPts} = 4$

$\varepsilon = 2$,
 $\text{minPts} = 4$

Vergleich



Group-Average-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link

average-link

complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

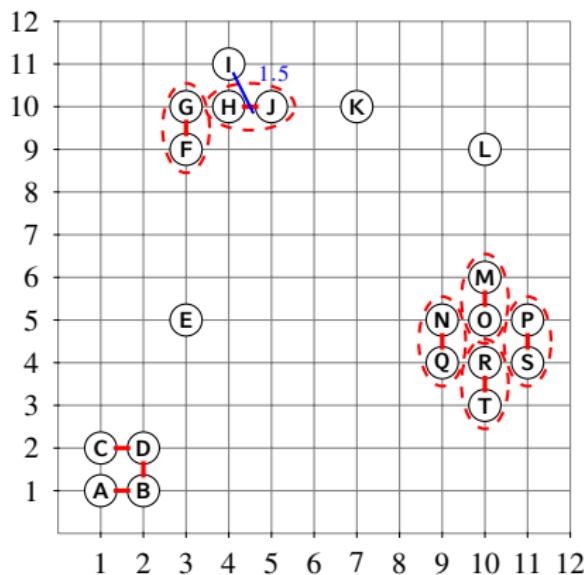
Aufgabe 4-3

$\varepsilon = 5$,
minPts = 2

$\varepsilon = 5$,
minPts = 4

$\varepsilon = 2$,
minPts = 4

Vergleich



Group-Average-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link

average-link

complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

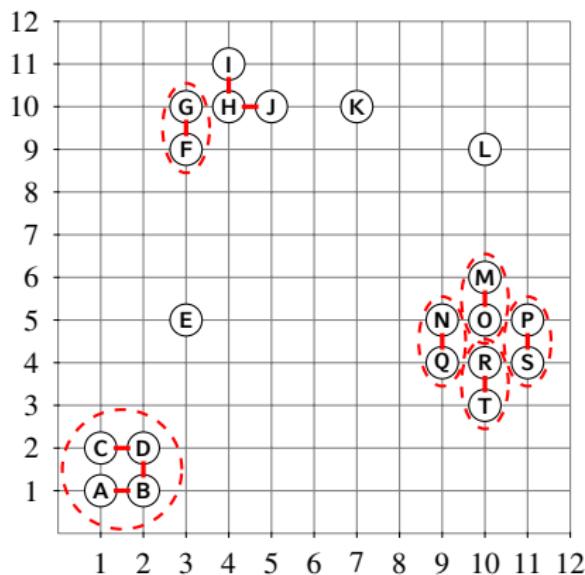
Aufgabe 4-3

$\varepsilon = 5$,
minPts = 2

$\varepsilon = 5$,
minPts = 4

$\varepsilon = 2$,
minPts = 4

Vergleich



Group-Average-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link

average-link

complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

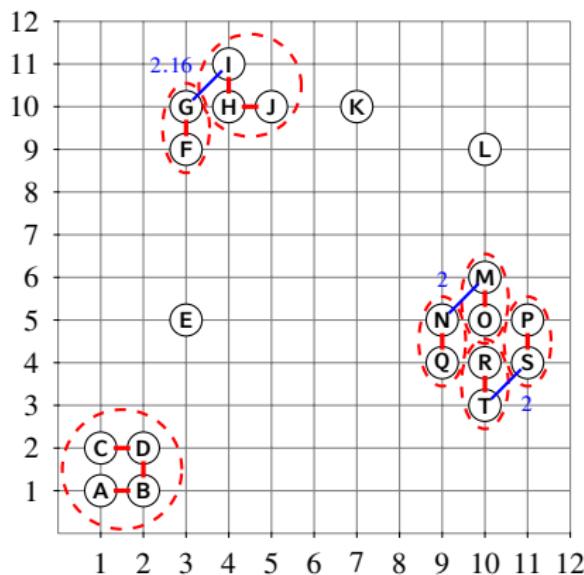
Aufgabe 4-3

$\varepsilon = 5$,
minPts = 2

$\varepsilon = 5$,
minPts = 4

$\varepsilon = 2$,
minPts = 4

Vergleich



Group-Average-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link

average-link

complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

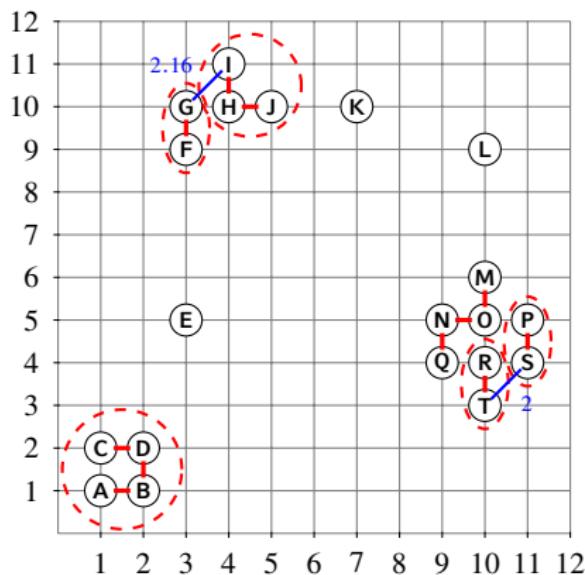
Aufgabe 4-3

$\varepsilon = 5$,
minPts = 2

$\varepsilon = 5$,
minPts = 4

$\varepsilon = 2$,
minPts = 4

Vergleich



Group-Average-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link

average-link

complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

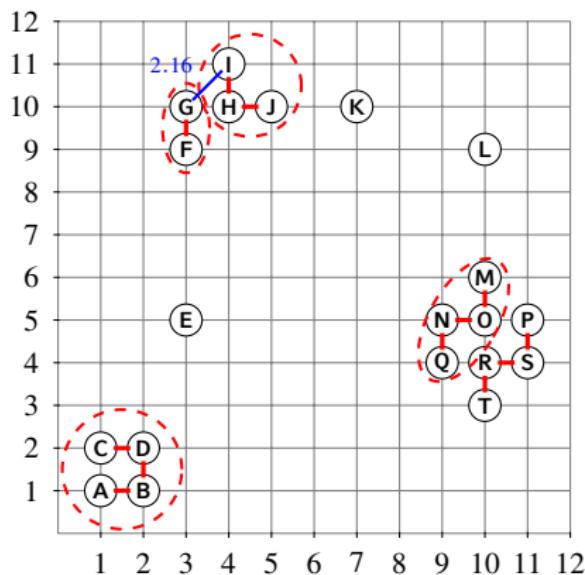
Aufgabe 4-3

$\varepsilon = 5$,
minPts = 2

$\varepsilon = 5$,
minPts = 4

$\varepsilon = 2$,
minPts = 4

Vergleich



Group-Average-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link

average-link

complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

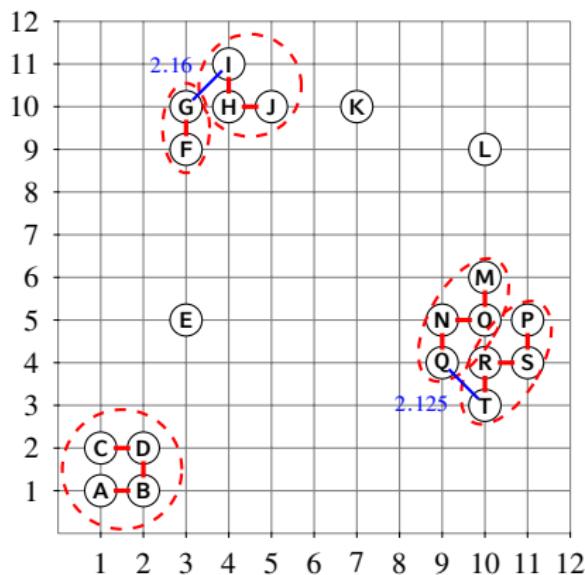
Aufgabe 4-3

$\varepsilon = 5$,
minPts = 2

$\varepsilon = 5$,
minPts = 4

$\varepsilon = 2$,
minPts = 4

Vergleich



Group-Average-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link

average-link

complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

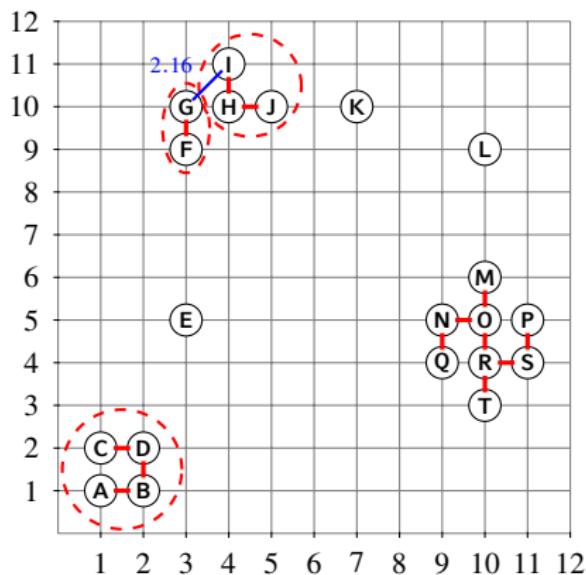
Aufgabe 4-3

$\varepsilon = 5$,
minPts = 2

$\varepsilon = 5$,
minPts = 4

$\varepsilon = 2$,
minPts = 4

Vergleich



Group-Average-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link

average-link

complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

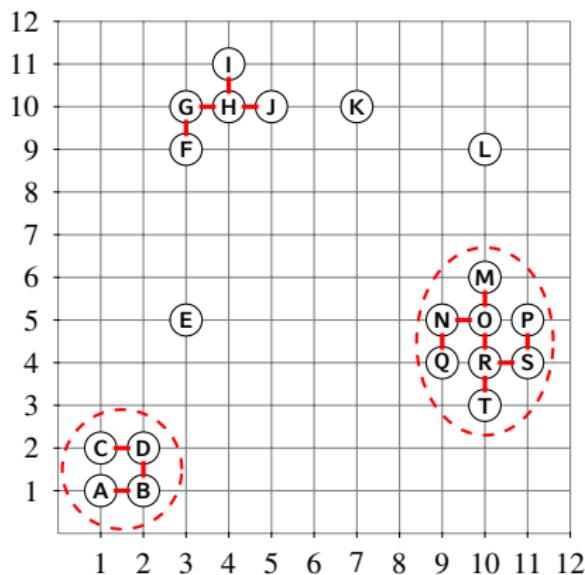
Aufgabe 4-3

$\varepsilon = 5$,
minPts = 2

$\varepsilon = 5$,
minPts = 4

$\varepsilon = 2$,
minPts = 4

Vergleich



Group-Average-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

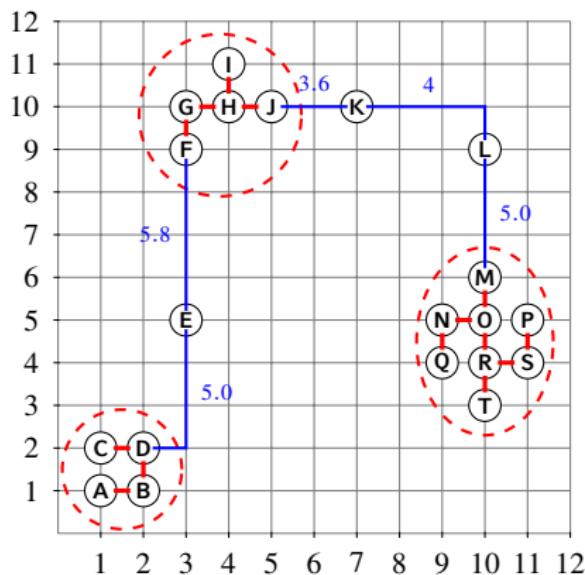
Aufgabe 4-3

$\varepsilon = 5$,
 $\text{minPts} = 2$

$\varepsilon = 5$,
 $\text{minPts} = 4$

$\varepsilon = 2$,
 $\text{minPts} = 4$

Vergleich



Group-Average-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link

average-link

complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

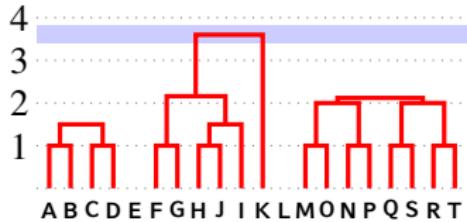
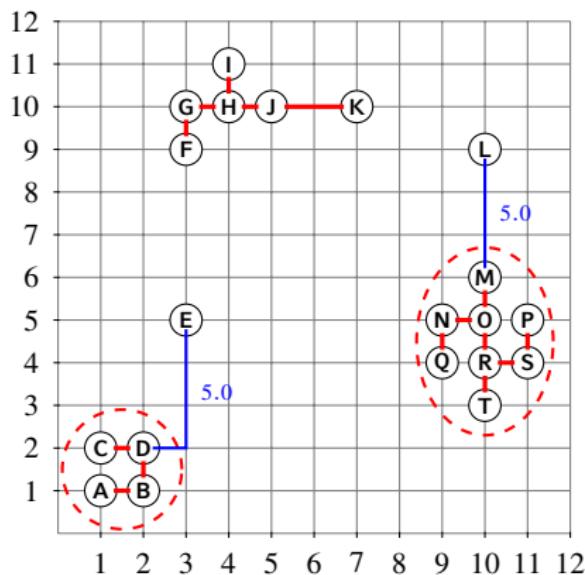
Aufgabe 4-3

$\varepsilon = 5$,
minPts = 2

$\varepsilon = 5$,
minPts = 4

$\varepsilon = 2$,
minPts = 4

Vergleich



Group-Average-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

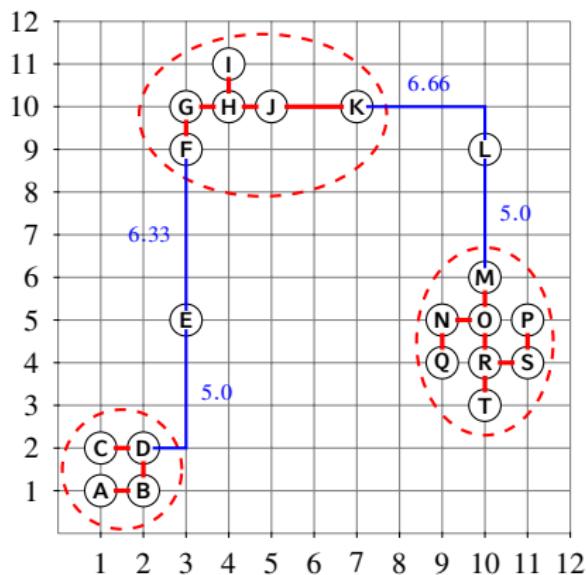
Aufgabe 4-3

$\varepsilon = 5$,
 $\text{minPts} = 2$

$\varepsilon = 5$,
 $\text{minPts} = 4$

$\varepsilon = 2$,
 $\text{minPts} = 4$

Vergleich



Group-Average-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link

average-link

complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

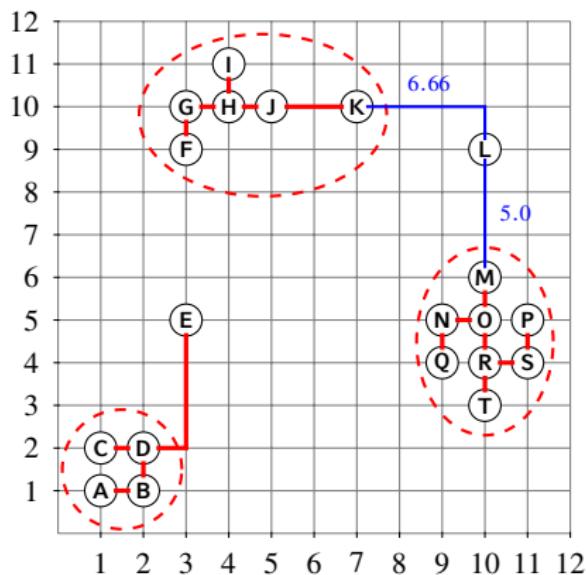
Aufgabe 4-3

$\varepsilon = 5$,
 $\text{minPts} = 2$

$\varepsilon = 5$,
 $\text{minPts} = 4$

$\varepsilon = 2$,
 $\text{minPts} = 4$

Vergleich



Group-Average-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

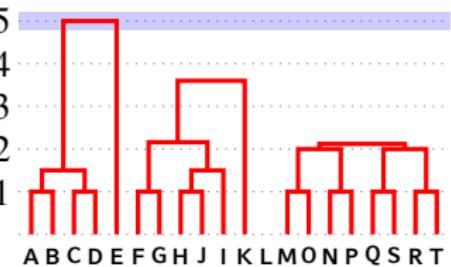
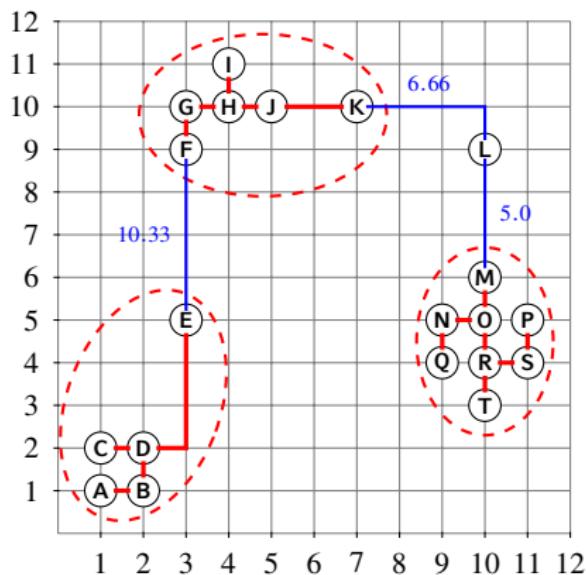
Aufgabe 4-3

$\varepsilon = 5$,
 $\text{minPts} = 2$

$\varepsilon = 5$,
 $\text{minPts} = 4$

$\varepsilon = 2$,
 $\text{minPts} = 4$

Vergleich



Group-Average-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

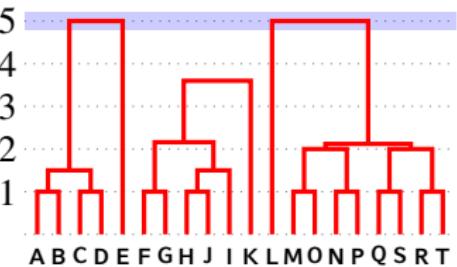
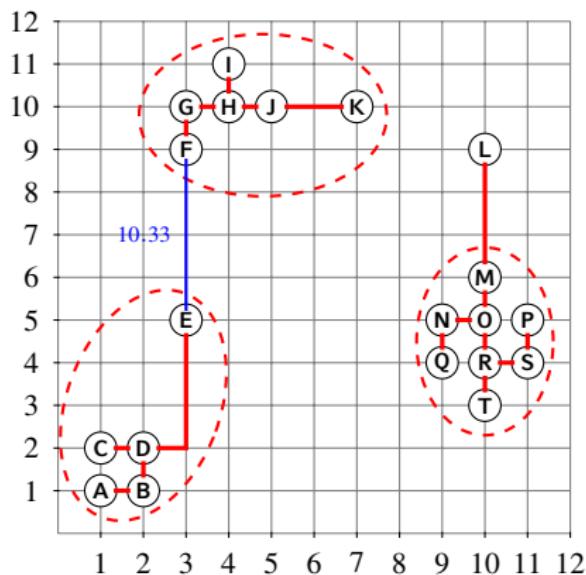
Aufgabe 4-3

$\varepsilon = 5$,
 $\text{minPts} = 2$

$\varepsilon = 5$,
 $\text{minPts} = 4$

$\varepsilon = 2$,
 $\text{minPts} = 4$

Vergleich



Group-Average-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

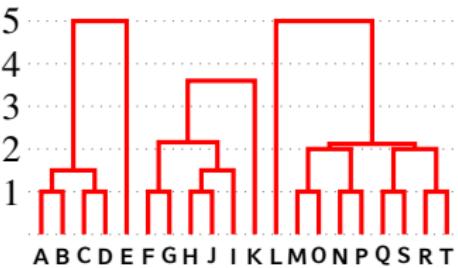
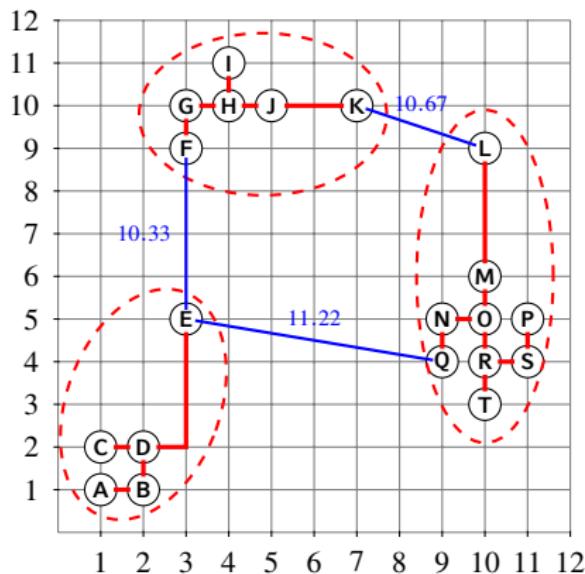
Aufgabe 4-3

$\varepsilon = 5$,
 $\text{minPts} = 2$

$\varepsilon = 5$,
 $\text{minPts} = 4$

$\varepsilon = 2$,
 $\text{minPts} = 4$

Vergleich



Group-Average-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

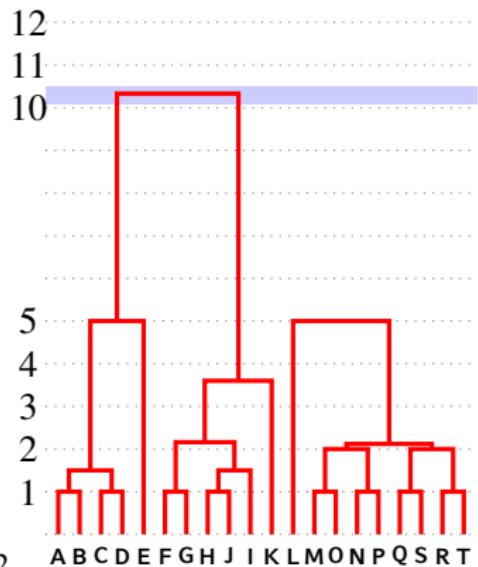
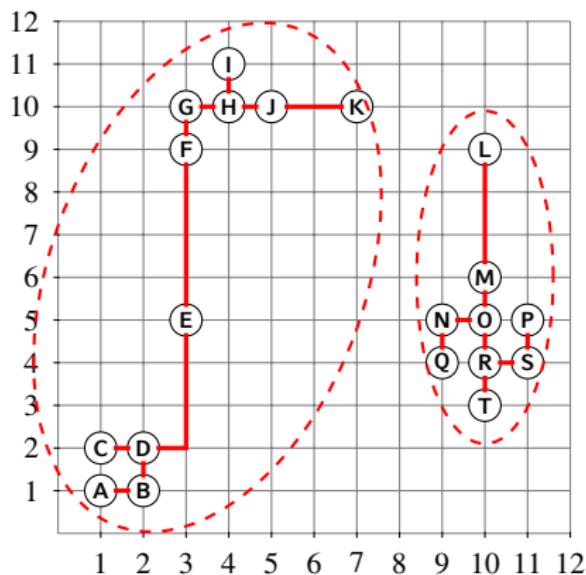
Aufgabe 4-3

$\varepsilon = 5$,
 $\text{minPts} = 2$

$\varepsilon = 5$,
 $\text{minPts} = 4$

$\varepsilon = 2$,
 $\text{minPts} = 4$

Vergleich



Group-Average-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

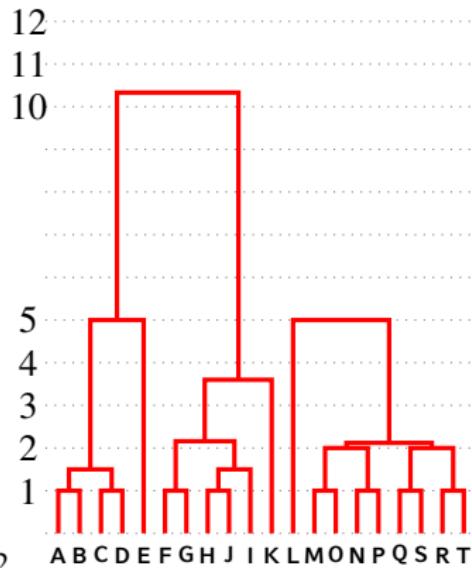
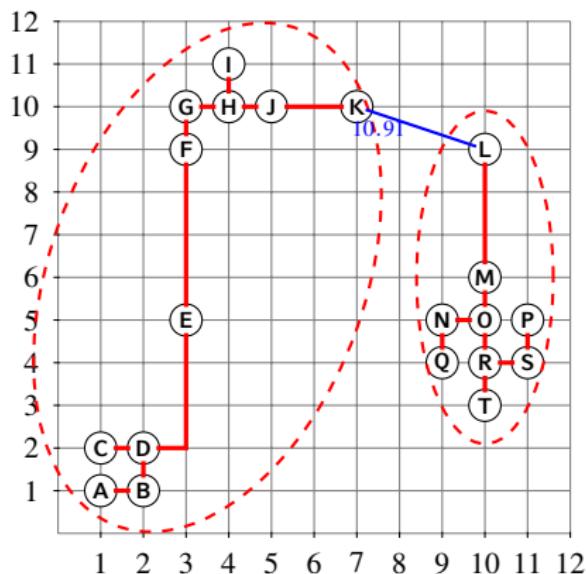
Aufgabe 4-3

$\varepsilon = 5$,
 $\text{minPts} = 2$

$\varepsilon = 5$,
 $\text{minPts} = 4$

$\varepsilon = 2$,
 $\text{minPts} = 4$

Vergleich



Group-Average-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link

average-link

complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

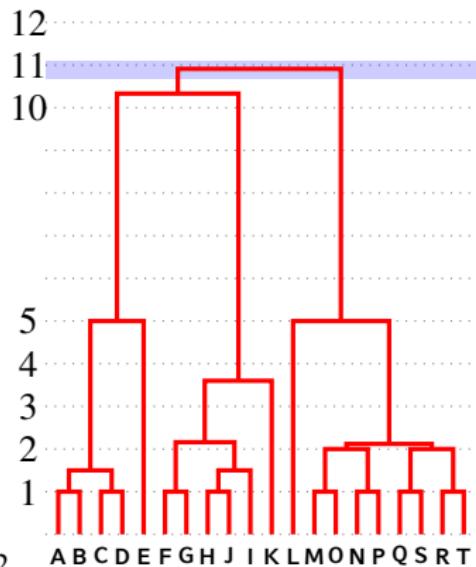
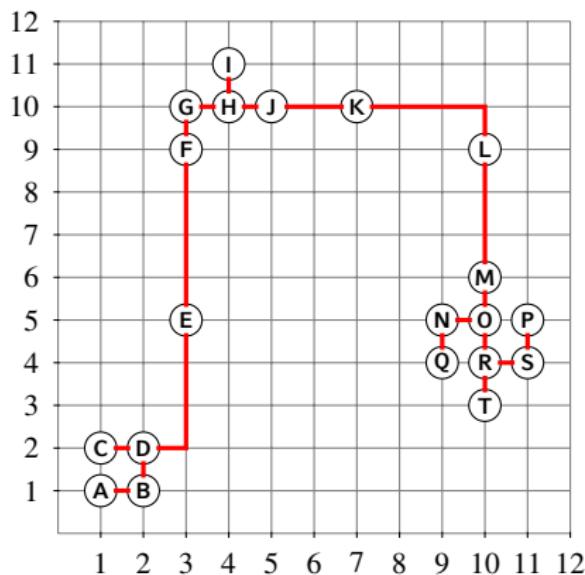
Aufgabe 4-3

$\varepsilon = 5$,
 $\text{minPts} = 2$

$\varepsilon = 5$,
 $\text{minPts} = 4$

$\varepsilon = 2$,
 $\text{minPts} = 4$

Vergleich



Complete-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

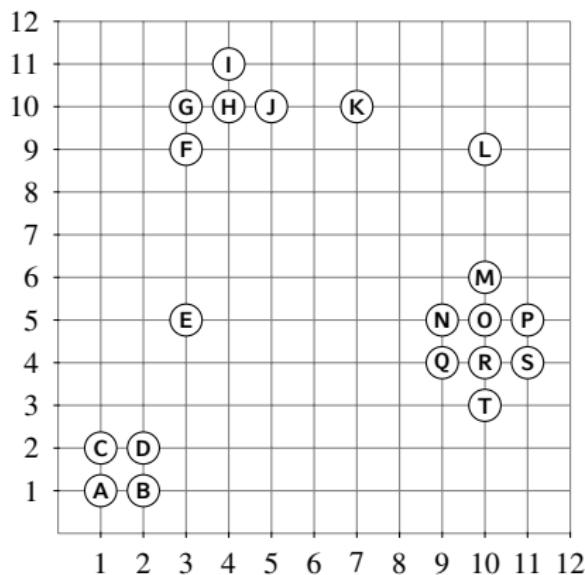
Aufgabe 4-3

$\varepsilon = 5$,
minPts = 2

$\varepsilon = 5$,
minPts = 4

$\varepsilon = 2$,
minPts = 4

Vergleich



A B C D E F G H J I K L M O N Q P S R T

Complete-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

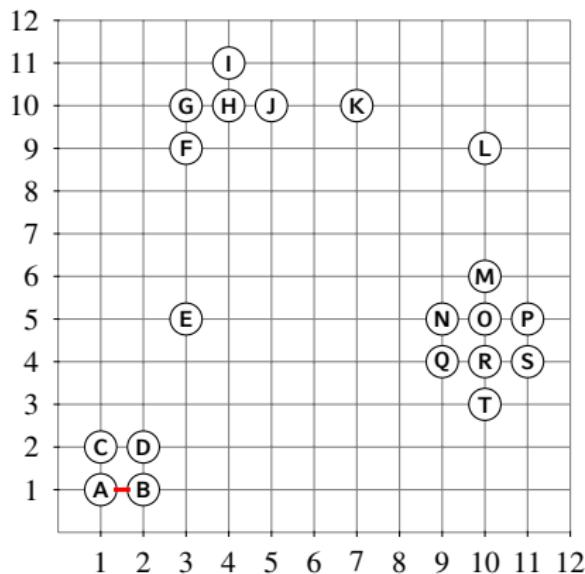
Aufgabe 4-3

$\varepsilon = 5$,
minPts = 2

$\varepsilon = 5$,
minPts = 4

$\varepsilon = 2$,
minPts = 4

Vergleich



Complete-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

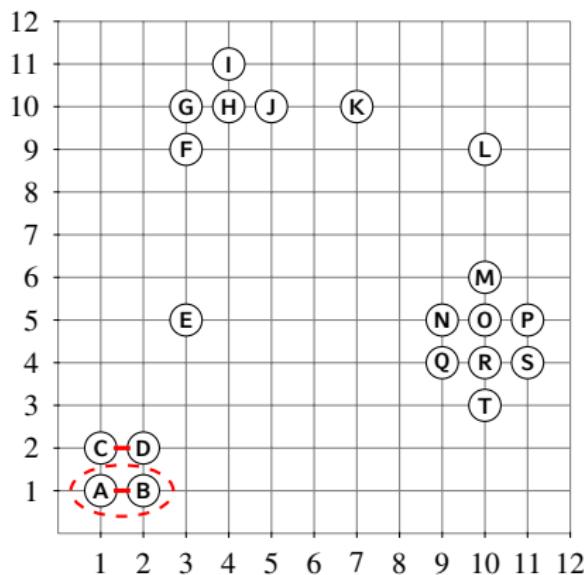
Aufgabe 4-3

$\varepsilon = 5$,
minPts = 2

$\varepsilon = 5$,
minPts = 4

$\varepsilon = 2$,
minPts = 4

Vergleich



Complete-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

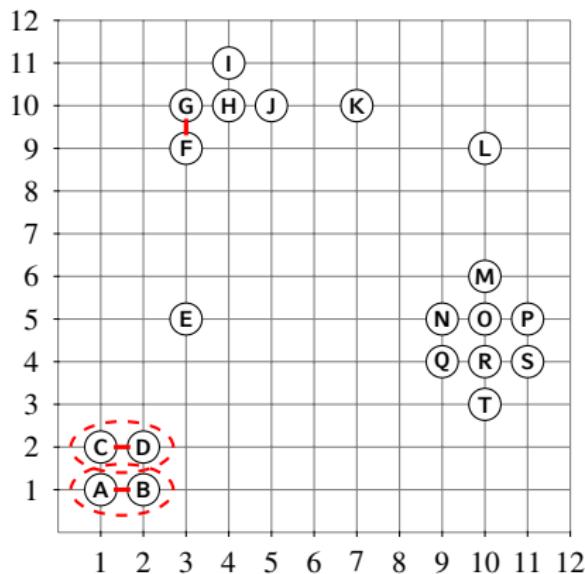
Aufgabe 4-3

$\varepsilon = 5$,
minPts = 2

$\varepsilon = 5$,
minPts = 4

$\varepsilon = 2$,
minPts = 4

Vergleich



Complete-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

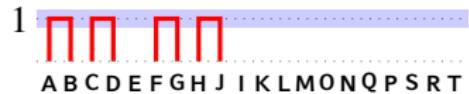
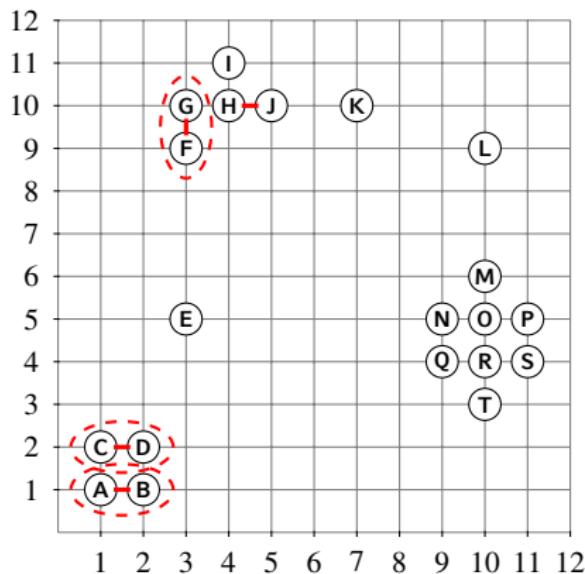
Aufgabe 4-3

$\varepsilon = 5$,
minPts = 2

$\varepsilon = 5$,
minPts = 4

$\varepsilon = 2$,
minPts = 4

Vergleich



Complete-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

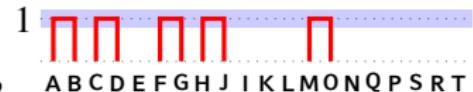
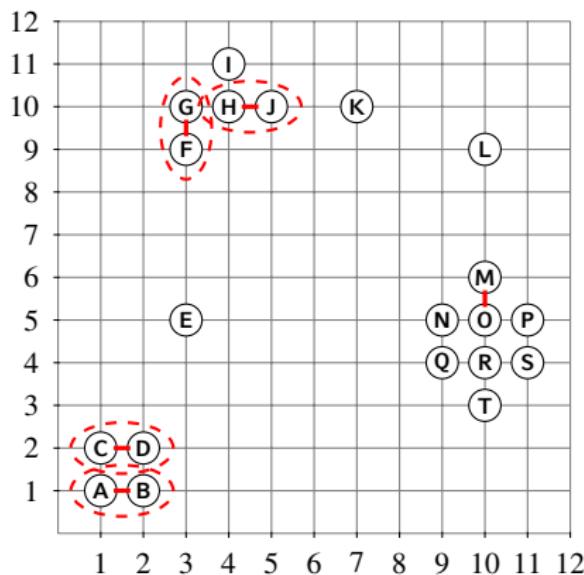
Aufgabe 4-3

$\varepsilon = 5$,
minPts = 2

$\varepsilon = 5$,
minPts = 4

$\varepsilon = 2$,
minPts = 4

Vergleich



Complete-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

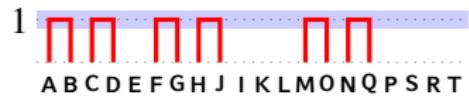
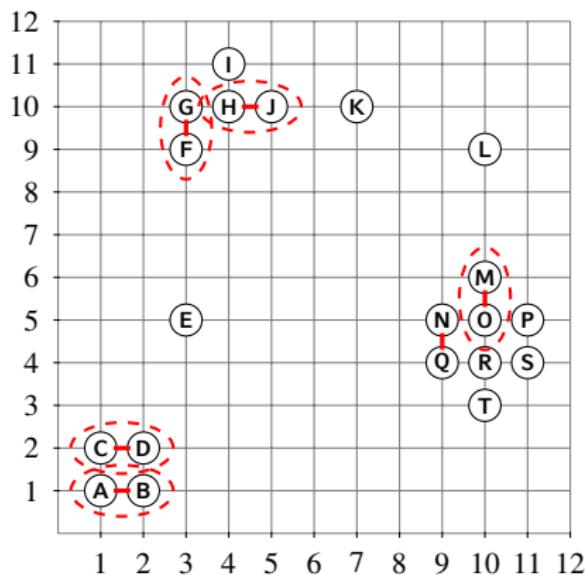
Aufgabe 4-3

$\varepsilon = 5$,
 $\text{minPts} = 2$

$\varepsilon = 5$,
 $\text{minPts} = 4$

$\varepsilon = 2$,
 $\text{minPts} = 4$

Vergleich



Complete-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

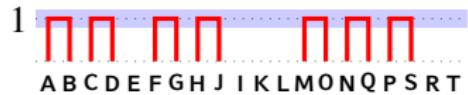
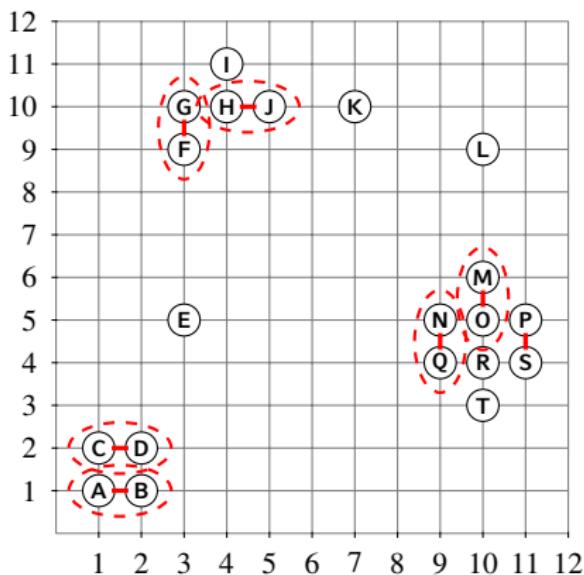
Aufgabe 4-3

$\varepsilon = 5$,
minPts = 2

$\varepsilon = 5$,
minPts = 4

$\varepsilon = 2$,
minPts = 4

Vergleich



Complete-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

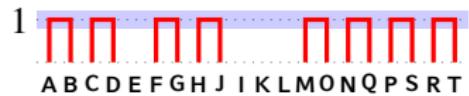
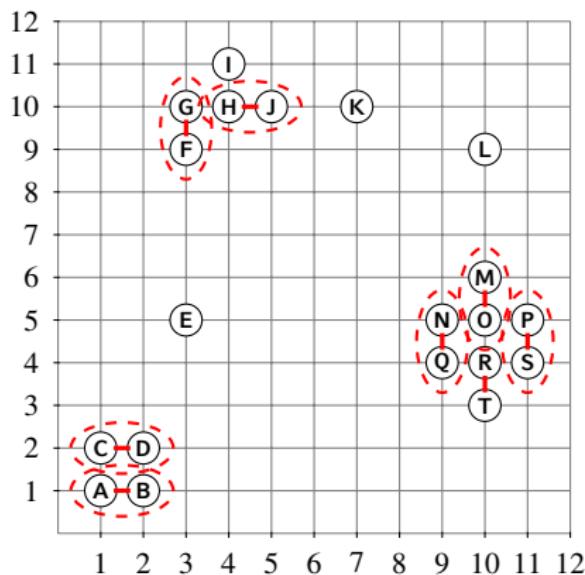
Aufgabe 4-3

$\varepsilon = 5$,
minPts = 2

$\varepsilon = 5$,
minPts = 4

$\varepsilon = 2$,
minPts = 4

Vergleich



Complete-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

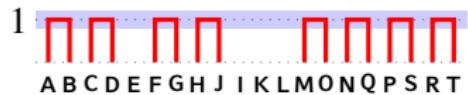
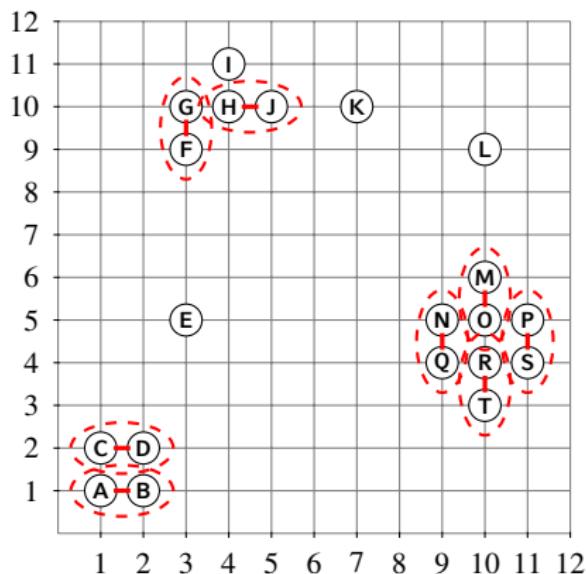
Aufgabe 4-3

$\varepsilon = 5$,
minPts = 2

$\varepsilon = 5$,
minPts = 4

$\varepsilon = 2$,
minPts = 4

Vergleich



Complete-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

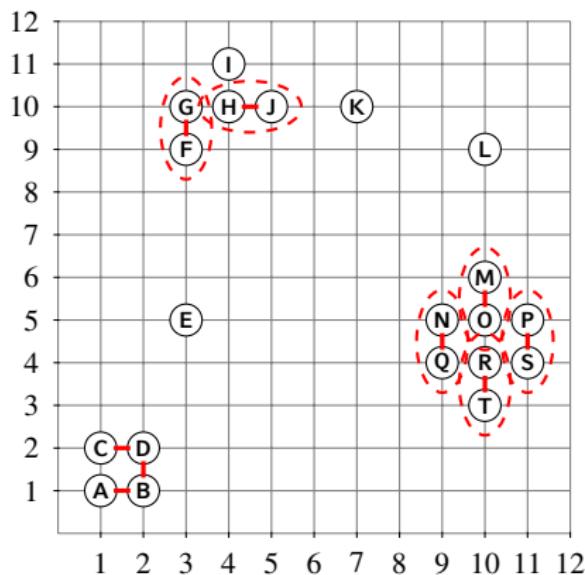
Aufgabe 4-3

$\varepsilon = 5$,
minPts = 2

$\varepsilon = 5$,
minPts = 4

$\varepsilon = 2$,
minPts = 4

Vergleich



Complete-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

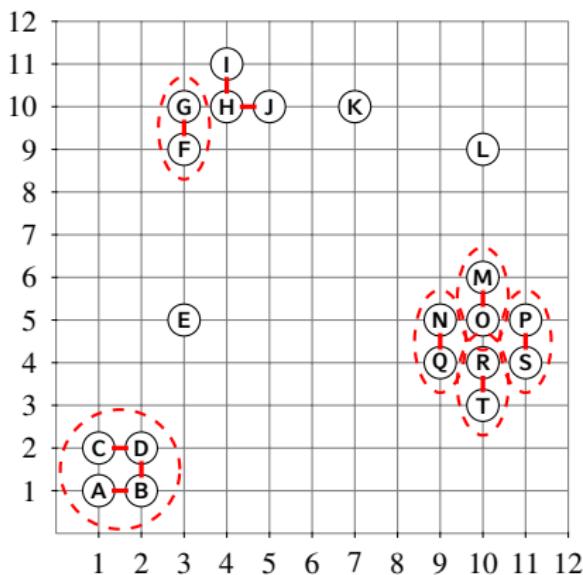
Aufgabe 4-3

$\varepsilon = 5$,
minPts = 2

$\varepsilon = 5$,
minPts = 4

$\varepsilon = 2$,
minPts = 4

Vergleich



Complete-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

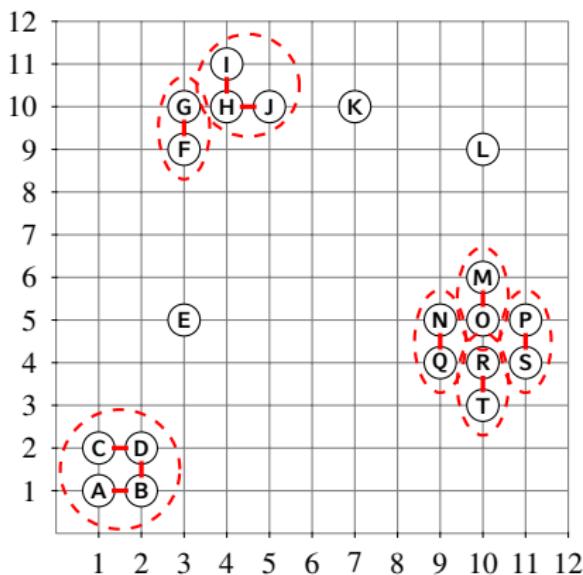
Aufgabe 4-3

$\varepsilon = 5$,
minPts = 2

$\varepsilon = 5$,
minPts = 4

$\varepsilon = 2$,
minPts = 4

Vergleich



Complete-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

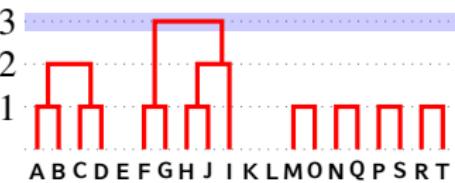
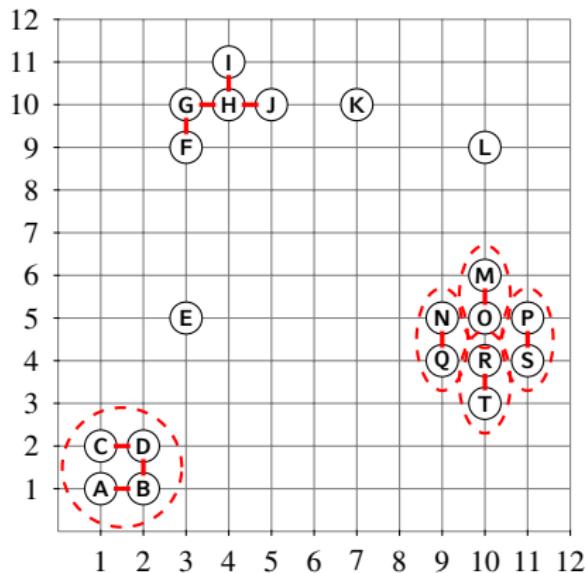
Aufgabe 4-3

$\varepsilon = 5$,
minPts = 2

$\varepsilon = 5$,
minPts = 4

$\varepsilon = 2$,
minPts = 4

Vergleich



Complete-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

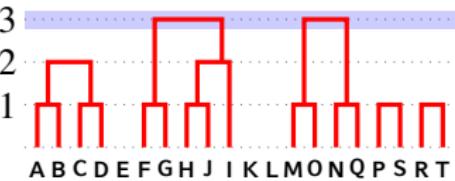
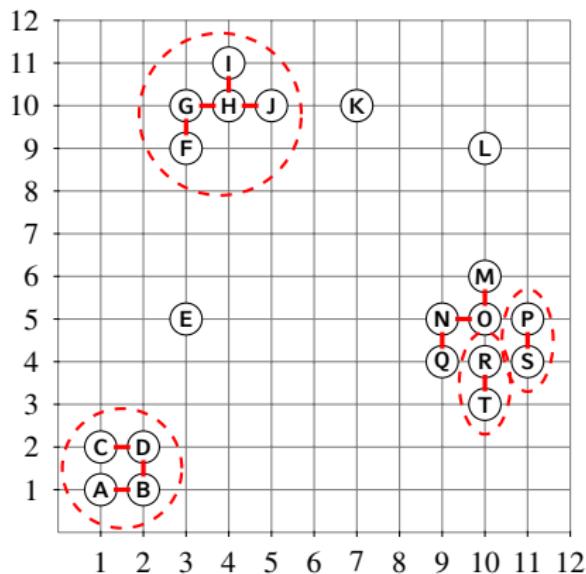
Aufgabe 4-3

$\varepsilon = 5$,
 $\text{minPts} = 2$

$\varepsilon = 5$,
 $\text{minPts} = 4$

$\varepsilon = 2$,
 $\text{minPts} = 4$

Vergleich



Complete-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

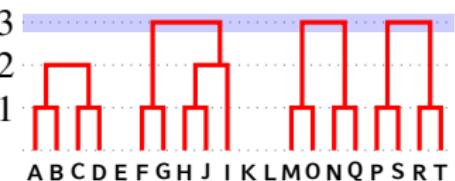
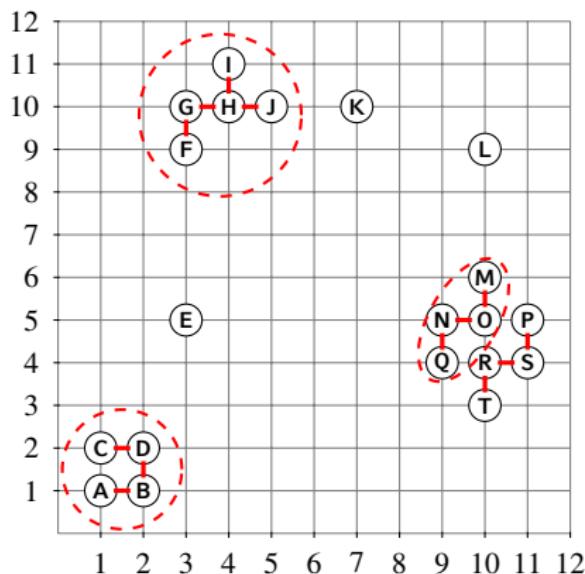
Aufgabe 4-3

$\varepsilon = 5$,
 $\text{minPts} = 2$

$\varepsilon = 5$,
 $\text{minPts} = 4$

$\varepsilon = 2$,
 $\text{minPts} = 4$

Vergleich



Complete-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

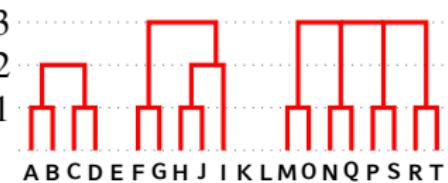
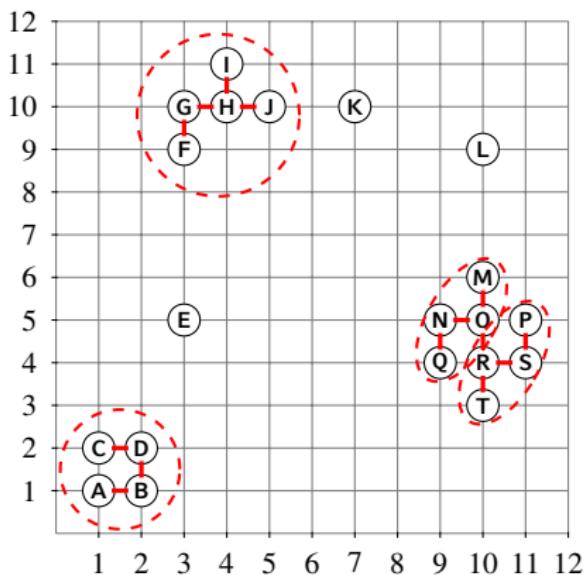
Aufgabe 4-3

$\varepsilon = 5$,
 $\text{minPts} = 2$

$\varepsilon = 5$,
 $\text{minPts} = 4$

$\varepsilon = 2$,
 $\text{minPts} = 4$

Vergleich



Complete-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

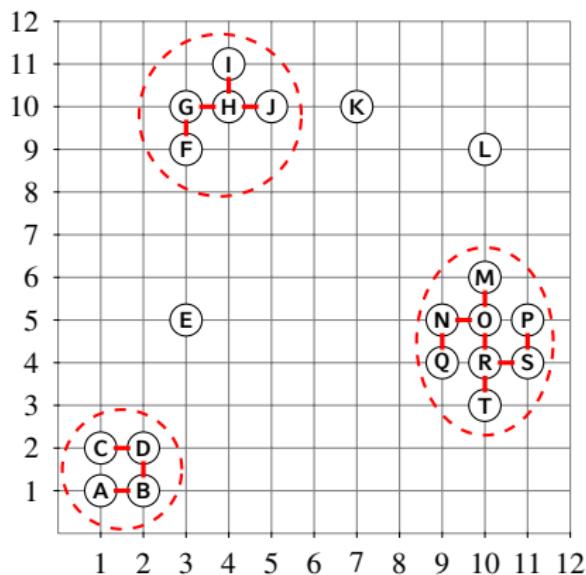
Aufgabe 4-3

$\varepsilon = 5$,
 $\text{minPts} = 2$

$\varepsilon = 5$,
 $\text{minPts} = 4$

$\varepsilon = 2$,
 $\text{minPts} = 4$

Vergleich



Complete-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

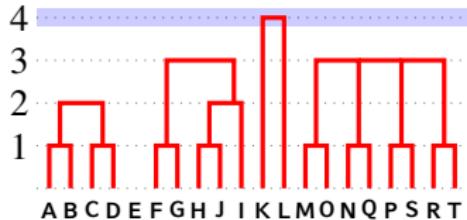
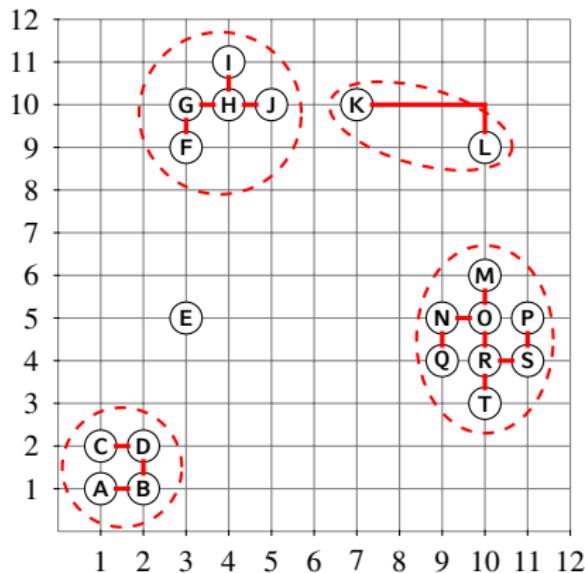
Aufgabe 4-3

$\varepsilon = 5$,
 $\text{minPts} = 2$

$\varepsilon = 5$,
 $\text{minPts} = 4$

$\varepsilon = 2$,
 $\text{minPts} = 4$

Vergleich



Complete-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

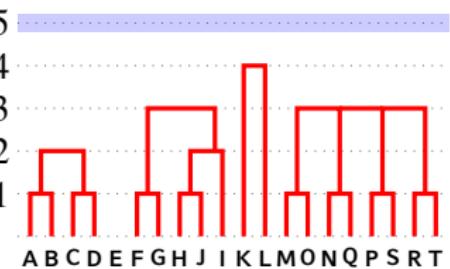
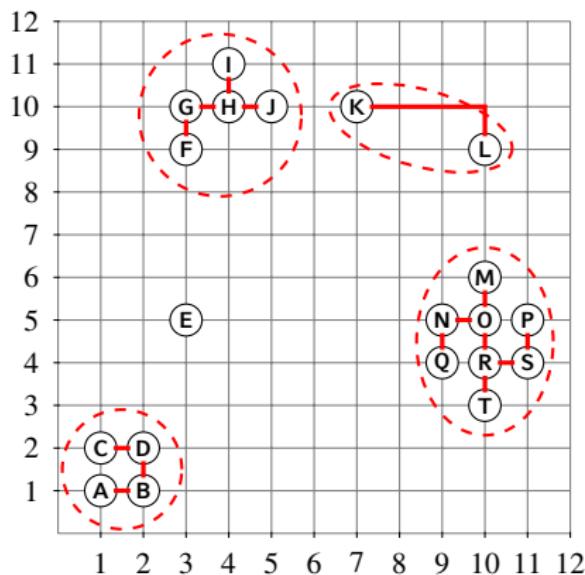
Aufgabe 4-3

$\varepsilon = 5$,
 $\text{minPts} = 2$

$\varepsilon = 5$,
 $\text{minPts} = 4$

$\varepsilon = 2$,
 $\text{minPts} = 4$

Vergleich



Complete-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

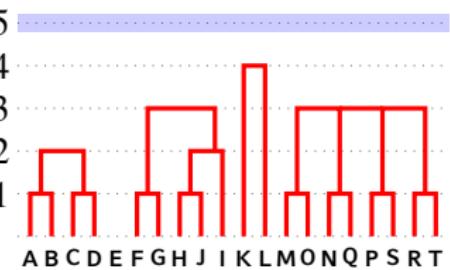
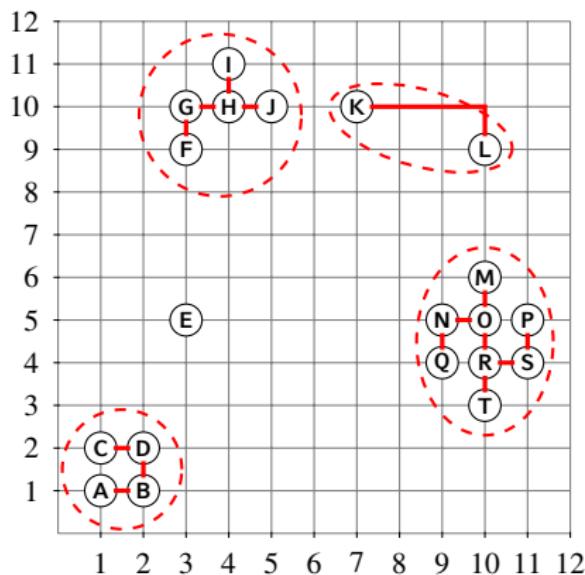
Aufgabe 4-3

$\varepsilon = 5$,
 $\text{minPts} = 2$

$\varepsilon = 5$,
 $\text{minPts} = 4$

$\varepsilon = 2$,
 $\text{minPts} = 4$

Vergleich



Complete-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

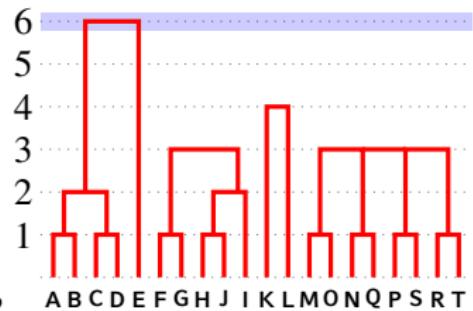
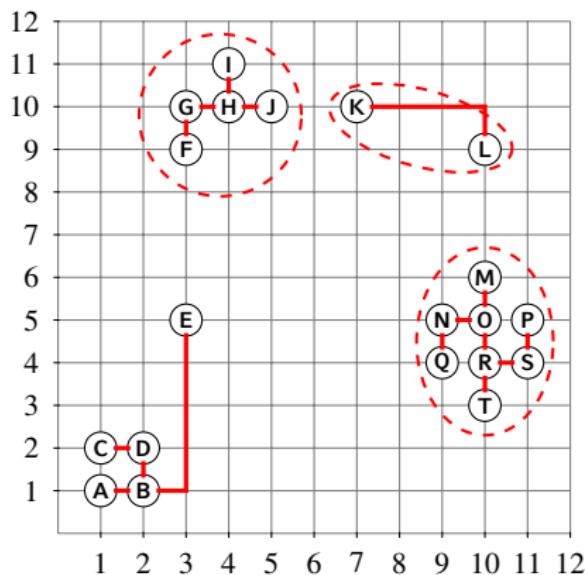
Aufgabe 4-3

$\varepsilon = 5$,
 $\text{minPts} = 2$

$\varepsilon = 5$,
 $\text{minPts} = 4$

$\varepsilon = 2$,
 $\text{minPts} = 4$

Vergleich



Complete-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

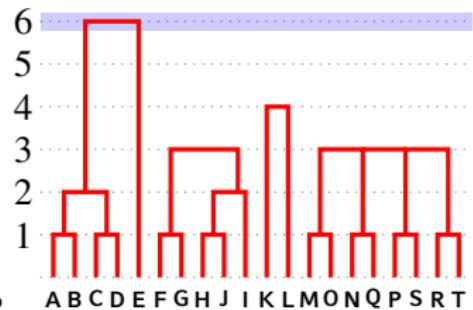
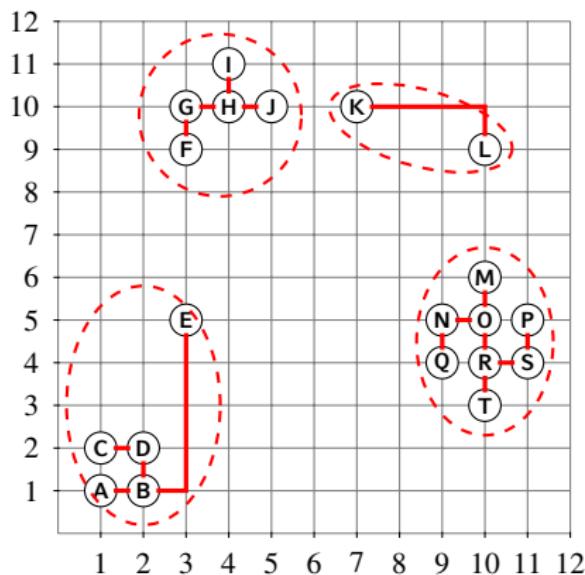
Aufgabe 4-3

$\varepsilon = 5$,
 $\text{minPts} = 2$

$\varepsilon = 5$,
 $\text{minPts} = 4$

$\varepsilon = 2$,
 $\text{minPts} = 4$

Vergleich



Complete-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

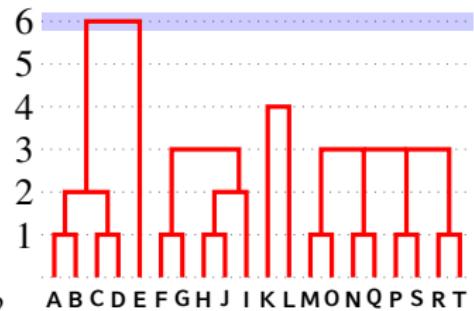
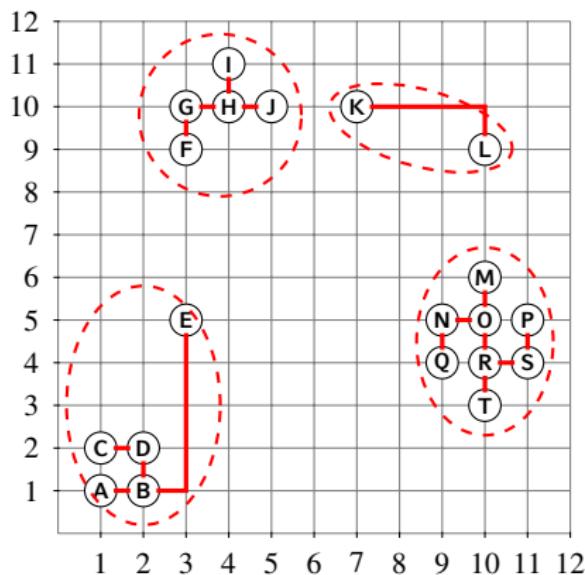
Aufgabe 4-3

$\varepsilon = 5$,
 $\text{minPts} = 2$

$\varepsilon = 5$,
 $\text{minPts} = 4$

$\varepsilon = 2$,
 $\text{minPts} = 4$

Vergleich



Complete-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

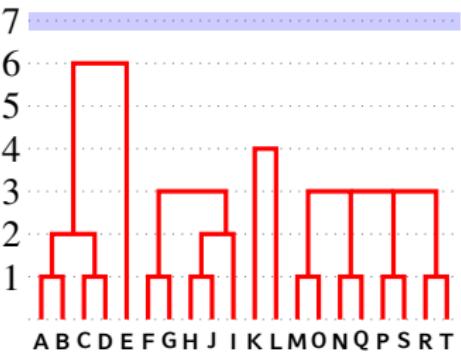
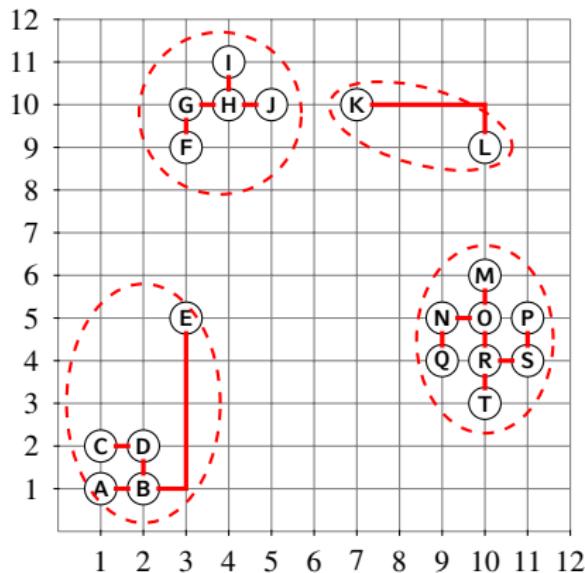
Aufgabe 4-3

$\varepsilon = 5$,
 $\text{minPts} = 2$

$\varepsilon = 5$,
 $\text{minPts} = 4$

$\varepsilon = 2$,
 $\text{minPts} = 4$

Vergleich



Complete-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

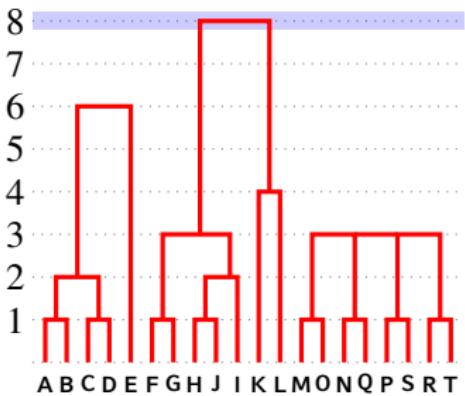
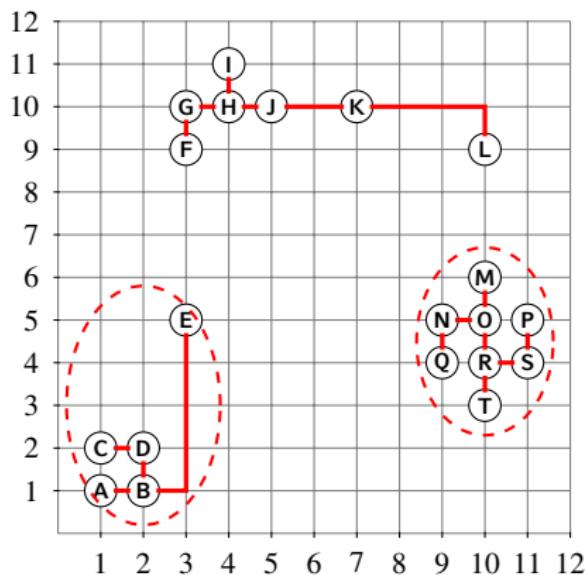
Aufgabe 4-3

$\varepsilon = 5$,
 $\text{minPts} = 2$

$\varepsilon = 5$,
 $\text{minPts} = 4$

$\varepsilon = 2$,
 $\text{minPts} = 4$

Vergleich



Complete-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

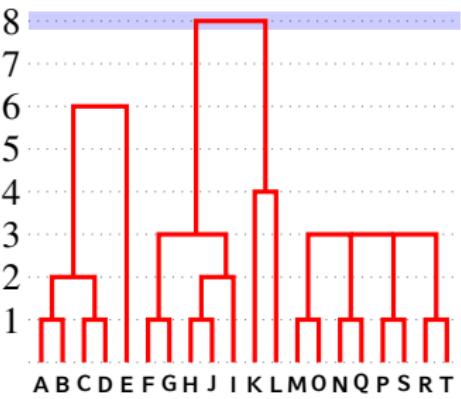
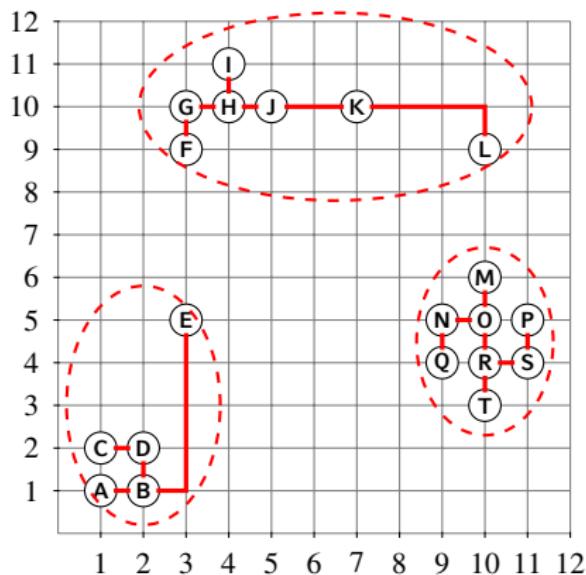
Aufgabe 4-3

$\varepsilon = 5$,
 $\text{minPts} = 2$

$\varepsilon = 5$,
 $\text{minPts} = 4$

$\varepsilon = 2$,
 $\text{minPts} = 4$

Vergleich



Complete-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

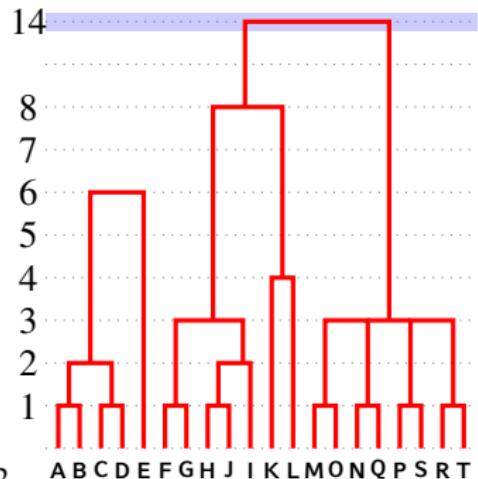
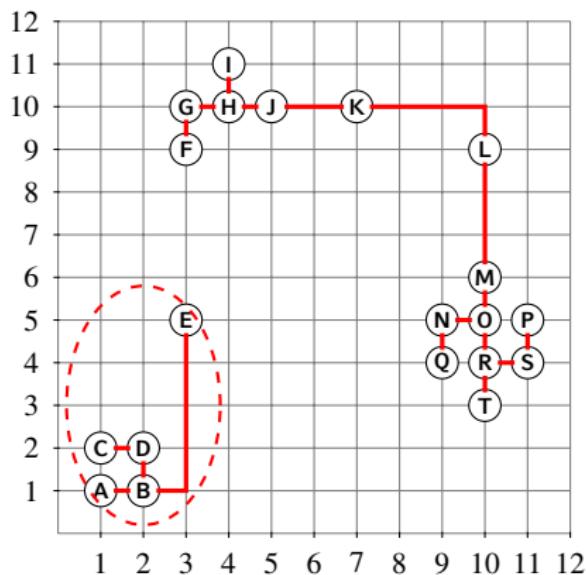
Aufgabe 4-3

$\varepsilon = 5$,
 $\text{minPts} = 2$

$\varepsilon = 5$,
 $\text{minPts} = 4$

$\varepsilon = 2$,
 $\text{minPts} = 4$

Vergleich



Complete-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

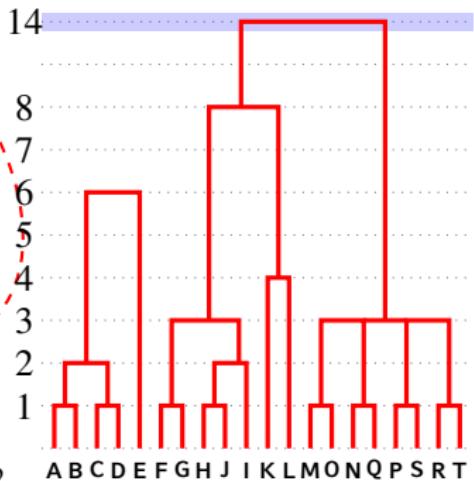
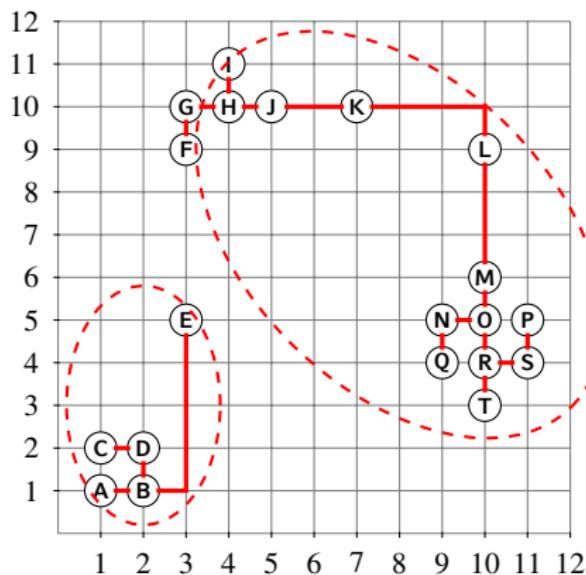
Aufgabe 4-3

$\varepsilon = 5$,
 $\text{minPts} = 2$

$\varepsilon = 5$,
 $\text{minPts} = 4$

$\varepsilon = 2$,
 $\text{minPts} = 4$

Vergleich



Complete-Link Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

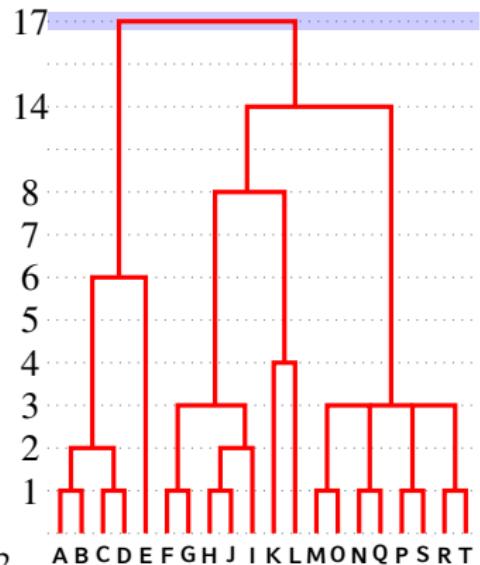
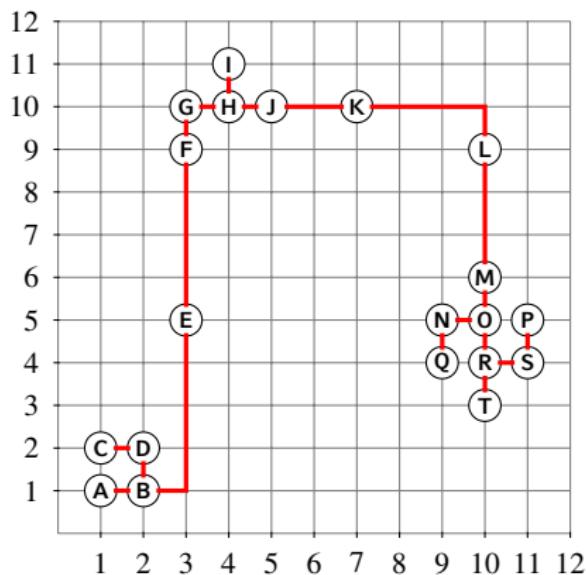
Aufgabe 4-3

$\varepsilon = 5$,
 $\text{minPts} = 2$

$\varepsilon = 5$,
 $\text{minPts} = 4$

$\varepsilon = 2$,
 $\text{minPts} = 4$

Vergleich



DBSCAN und Single-Linkage Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

$\varepsilon = 5$,
minPts= 2

$\varepsilon = 5$,
minPts= 4

$\varepsilon = 2$,
minPts= 4

Vergleich

DBSCAN und Single-Linkage Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

$\varepsilon = 5$,
minPts = 2

$\varepsilon = 5$,
minPts = 4

$\varepsilon = 2$,
minPts = 4

Vergleich

DBSCAN und Single-Linkage Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

$\varepsilon = 5$,
 $\text{minPts} = 2$

$\varepsilon = 5$,
 $\text{minPts} = 4$

$\varepsilon = 2$,
 $\text{minPts} = 4$

Vergleich

DBSCAN mit $\text{minPts} = 2 \Leftrightarrow$
Schnitt durch das single-linkage dendrogram auf Höhe ε .

DBSCAN ist $\mathcal{O}(n^2)$ (mit Index auch nur: $\mathcal{O}(n \log n)$)
aber nur für ein einziges ε .

DBSCAN und Single-Linkage Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

$\varepsilon = 5$,
minPts= 2
 $\varepsilon = 5$,
minPts= 4
 $\varepsilon = 2$,
minPts= 4
Vergleich

DBSCAN mit $minPts = 2 \Leftrightarrow$
Schnitt durch das single-linkage dendrogram auf Höhe ε .

DBSCAN ist $\mathcal{O}(n^2)$ (mit Index auch nur: $\mathcal{O}(n \log n)$)
aber nur für ein einziges ε .

OPTICS mit $minPts = 2$ entspricht etwa SLINK
(Effizienter Algorithmus für single-linkage in $\mathcal{O}(n^2)$)

DBSCAN und Single-Linkage Clustering

Data Mining
Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

$\varepsilon = 5$,
minPts= 2
 $\varepsilon = 5$,
minPts= 4
 $\varepsilon = 2$,
minPts= 4
Vergleich

DBSCAN mit $minPts = 2 \Leftrightarrow$
Schnitt durch das single-linkage dendrogram auf Höhe ε .

DBSCAN ist $\mathcal{O}(n^2)$ (mit Index auch nur: $\mathcal{O}(n \log n)$)
aber nur für ein einziges ε .

OPTICS mit $minPts = 2$ entspricht etwa SLINK
(Effizienter Algorithmus für single-linkage in $\mathcal{O}(n^2)$)

Aber mit einem größeren $minPts$ werden die Ergebnisse i.d.R. besser (statt single-link-effekt: Dichte-verbunden)!

Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

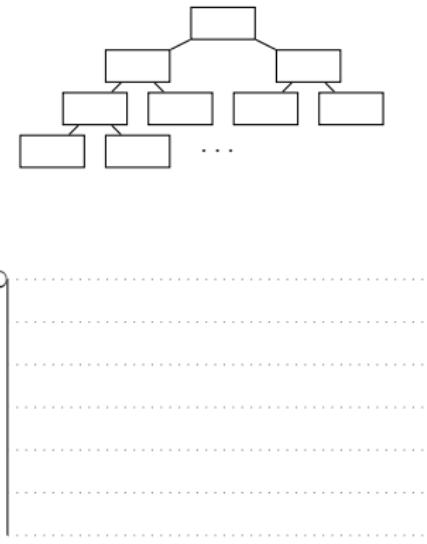
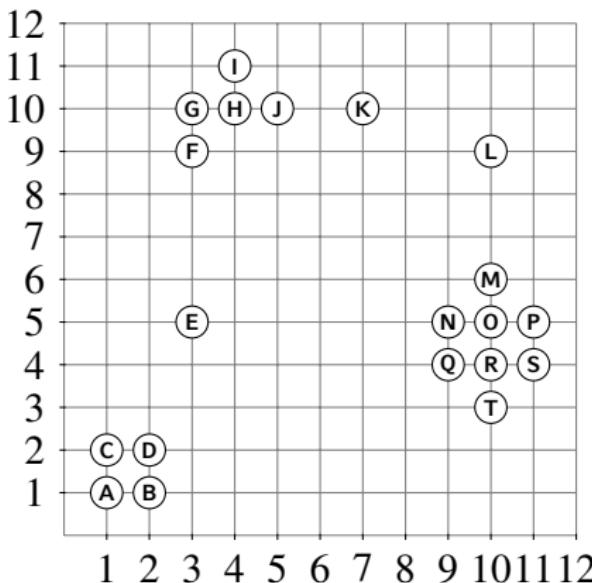
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

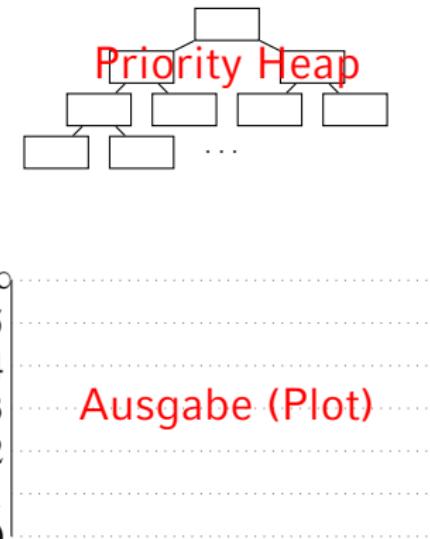
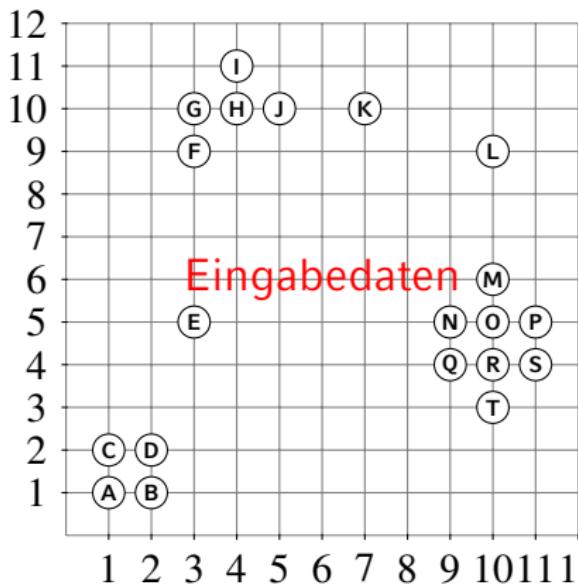
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Heap: Für die Vorlesung reicht eine Sortierte Liste

Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

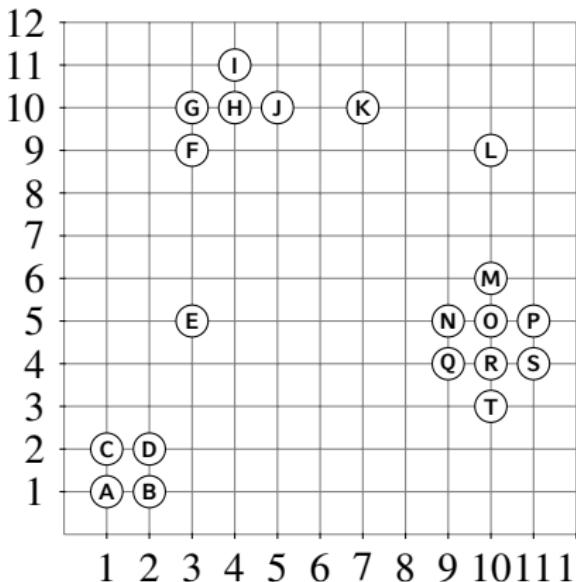
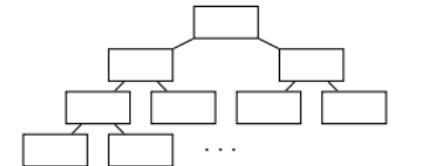
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich

0 1 2 3 4 5 ∞ 

Data Mining Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

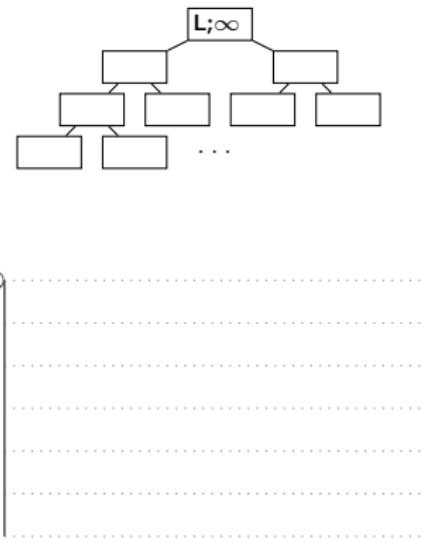
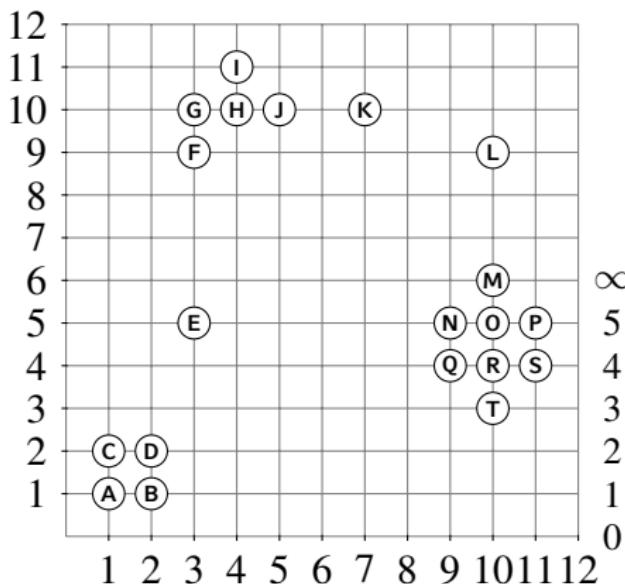
Aufgabe 4-3

$\varepsilon = 5$,
minPts= 2

$\varepsilon = 5$,
minPts = 4

$\varepsilon = 2$,
minPts= 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

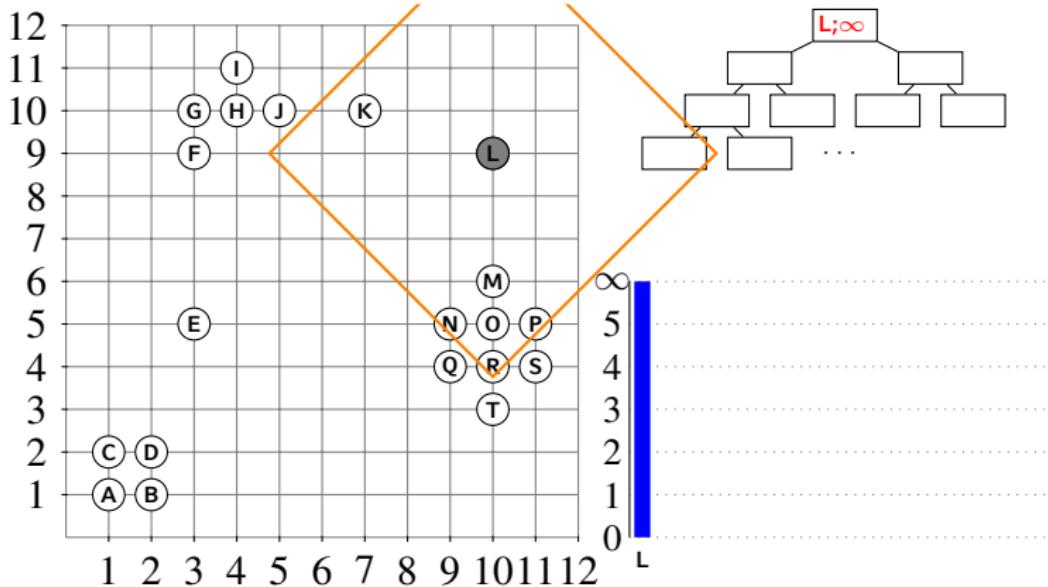
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
 $\text{minPts} = 2$ $\varepsilon = 5$,
 $\text{minPts} = 4$ $\varepsilon = 2$,
 $\text{minPts} = 4$

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

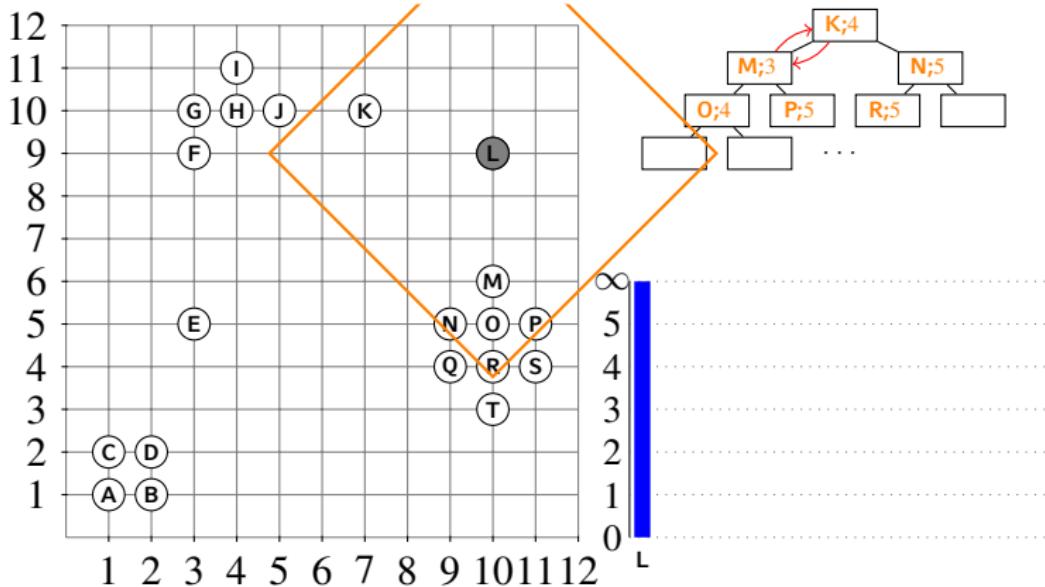
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
 $\text{minPts} = 2$ $\varepsilon = 5$,
 $\text{minPts} = 4$ $\varepsilon = 2$,
 $\text{minPts} = 4$

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

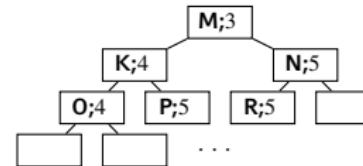
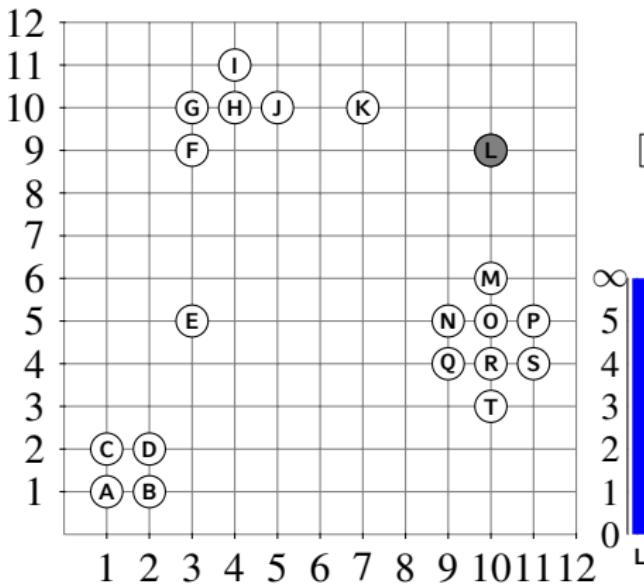
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

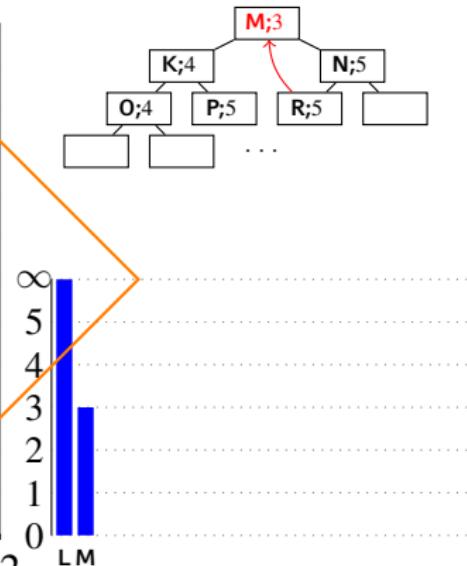
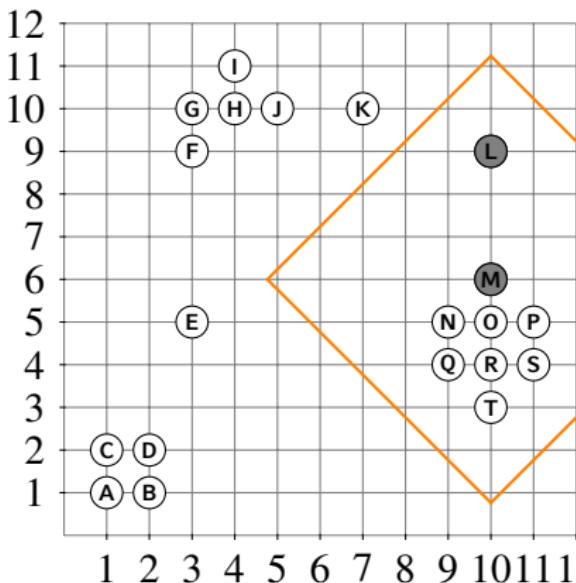
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
 $\text{minPts} = 2$ $\varepsilon = 5$,
 $\text{minPts} = 4$ $\varepsilon = 2$,
 $\text{minPts} = 4$

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

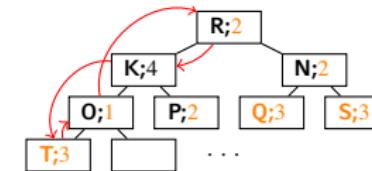
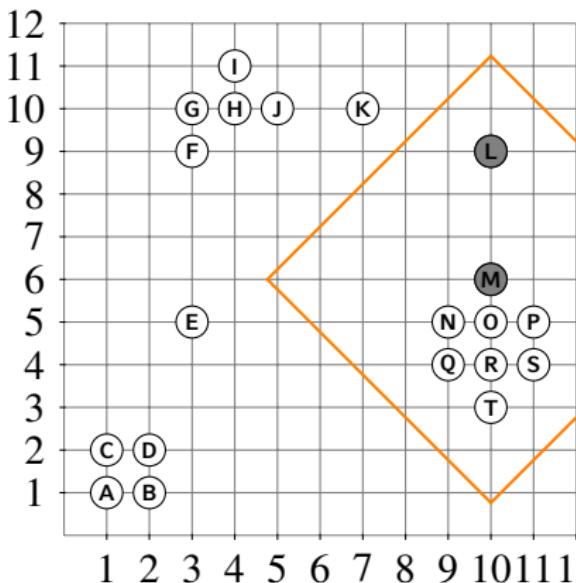
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
 $\text{minPts} = 2$ $\varepsilon = 5$,
 $\text{minPts} = 4$ $\varepsilon = 2$,
 $\text{minPts} = 4$

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

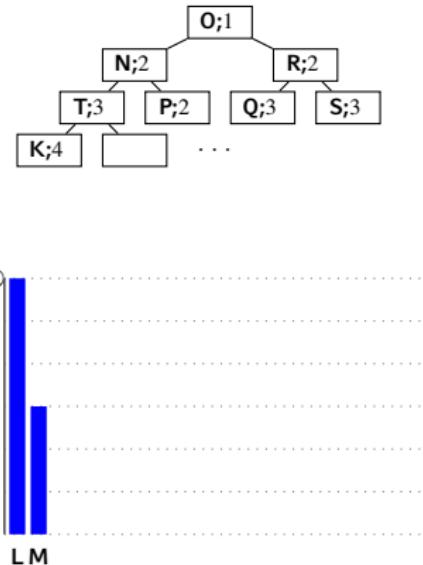
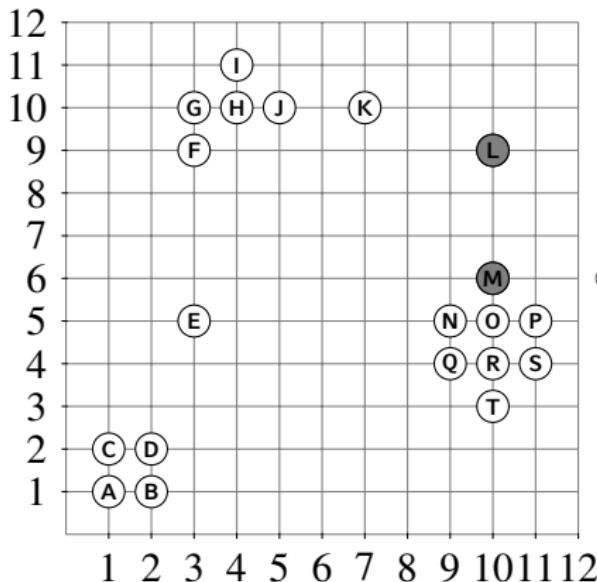
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

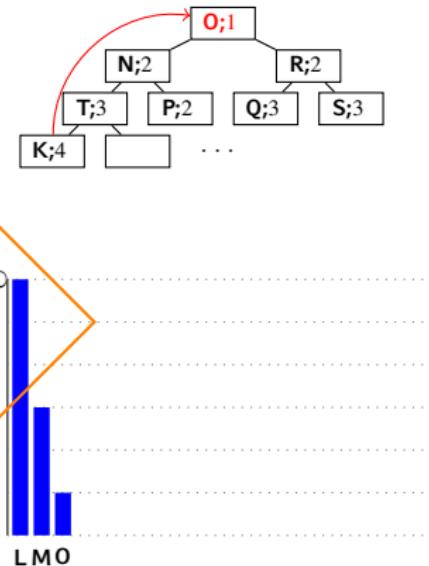
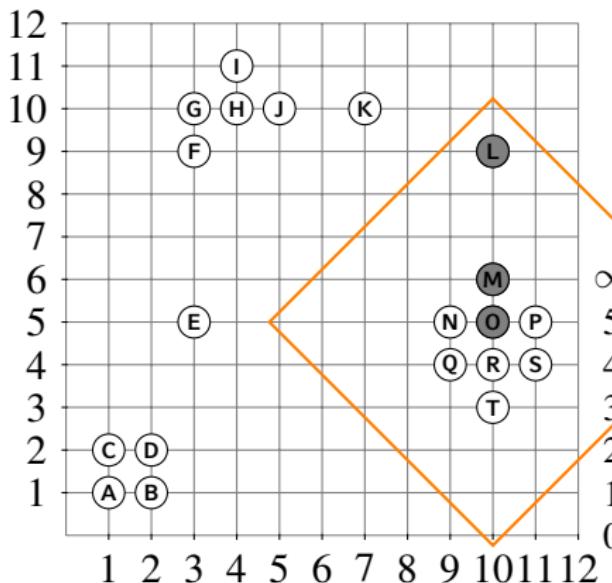
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
 $\text{minPts} = 2$ $\varepsilon = 5$,
 $\text{minPts} = 4$ $\varepsilon = 2$,
 $\text{minPts} = 4$

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

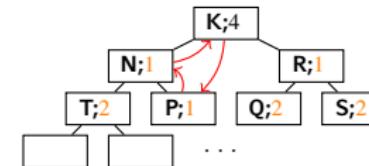
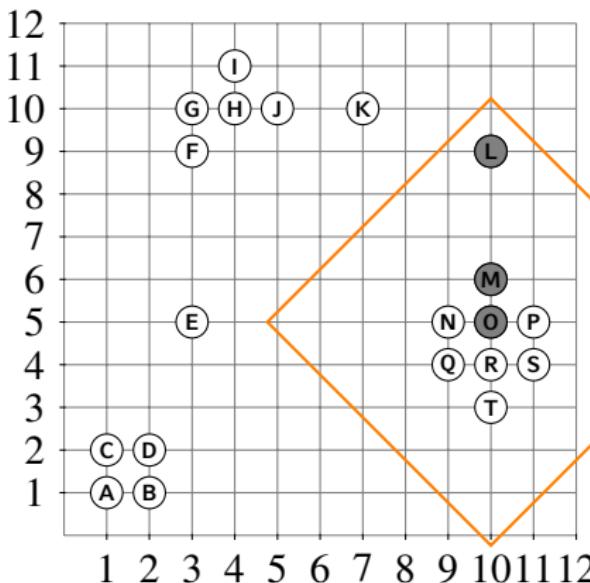
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
 $\text{minPts} = 2$ $\varepsilon = 5$,
 $\text{minPts} = 4$ $\varepsilon = 2$,
 $\text{minPts} = 4$

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

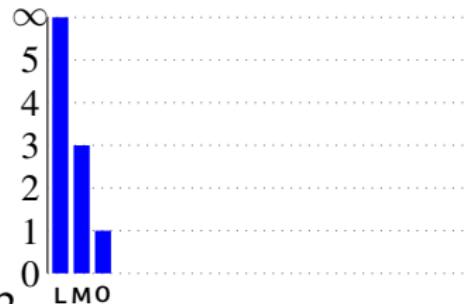
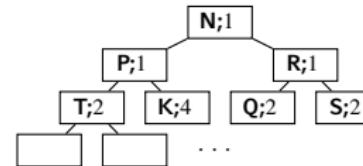
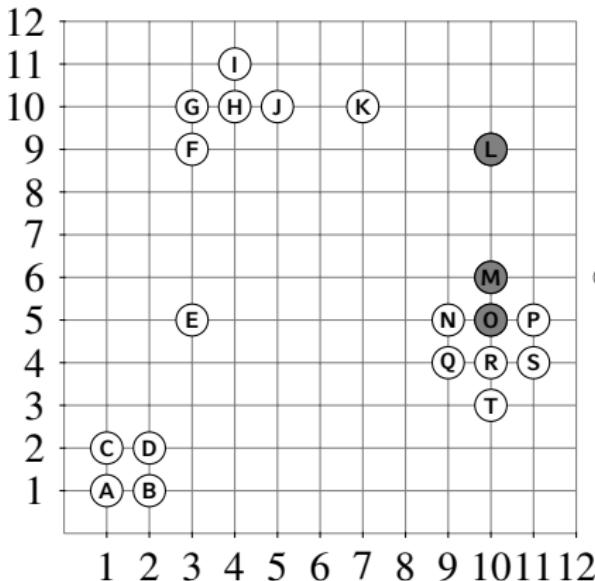
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

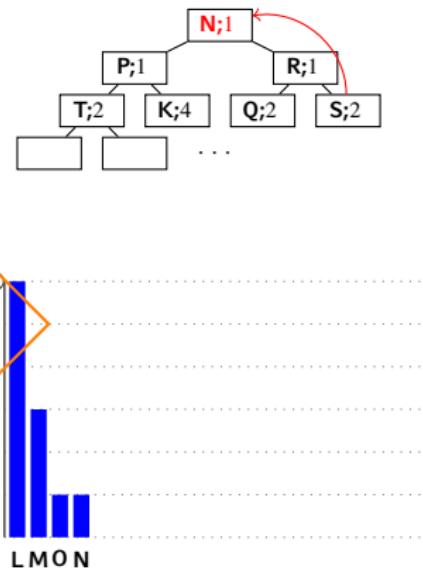
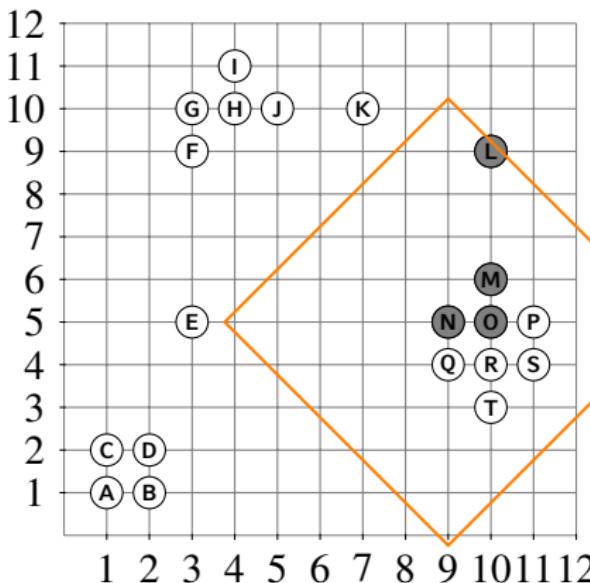
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
 $\text{minPts} = 2$ $\varepsilon = 5$,
 $\text{minPts} = 4$ $\varepsilon = 2$,
 $\text{minPts} = 4$

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

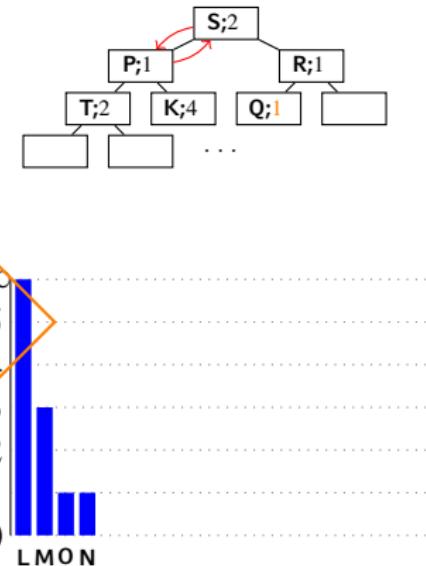
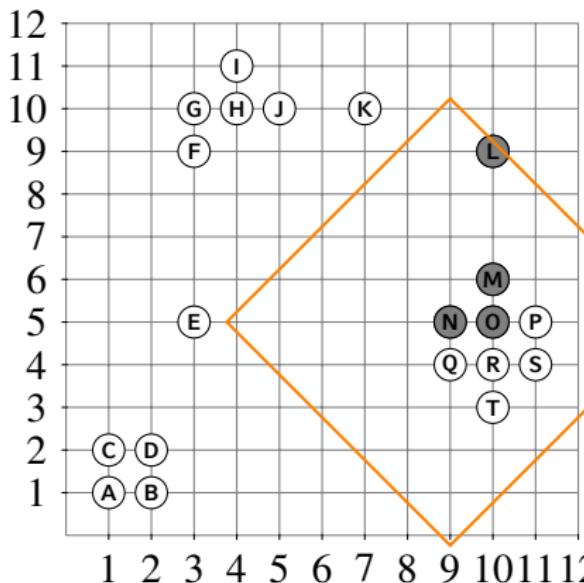
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
 $\text{minPts} = 2$ $\varepsilon = 5$,
 $\text{minPts} = 4$ $\varepsilon = 2$,
 $\text{minPts} = 4$

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

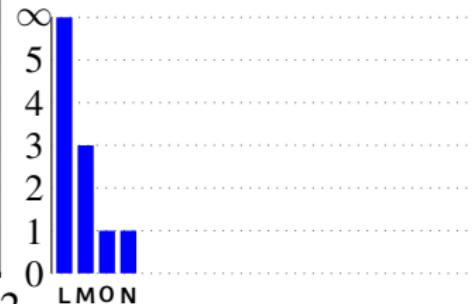
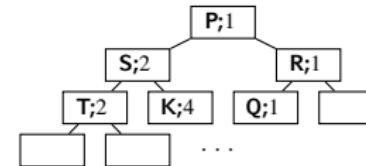
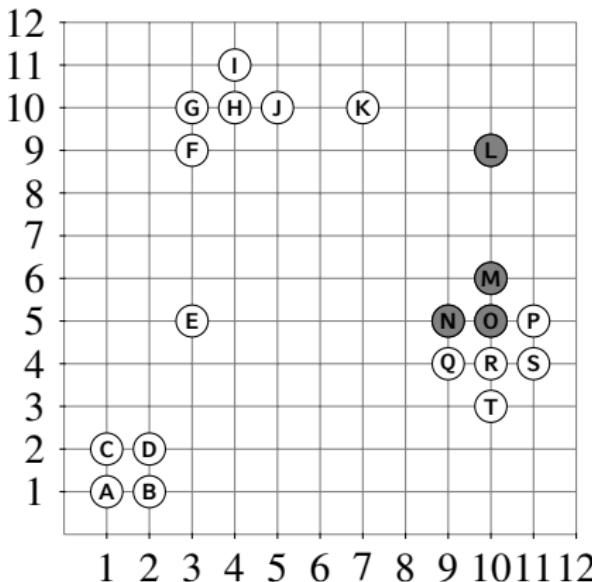
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

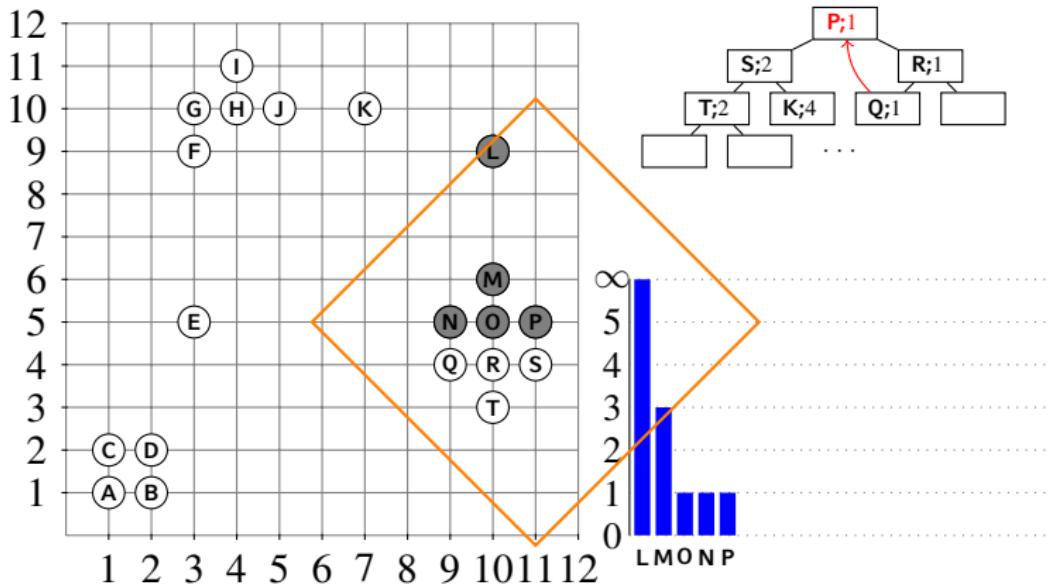
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
 $\text{minPts} = 2$ $\varepsilon = 5$,
 $\text{minPts} = 4$ $\varepsilon = 2$,
 $\text{minPts} = 4$

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

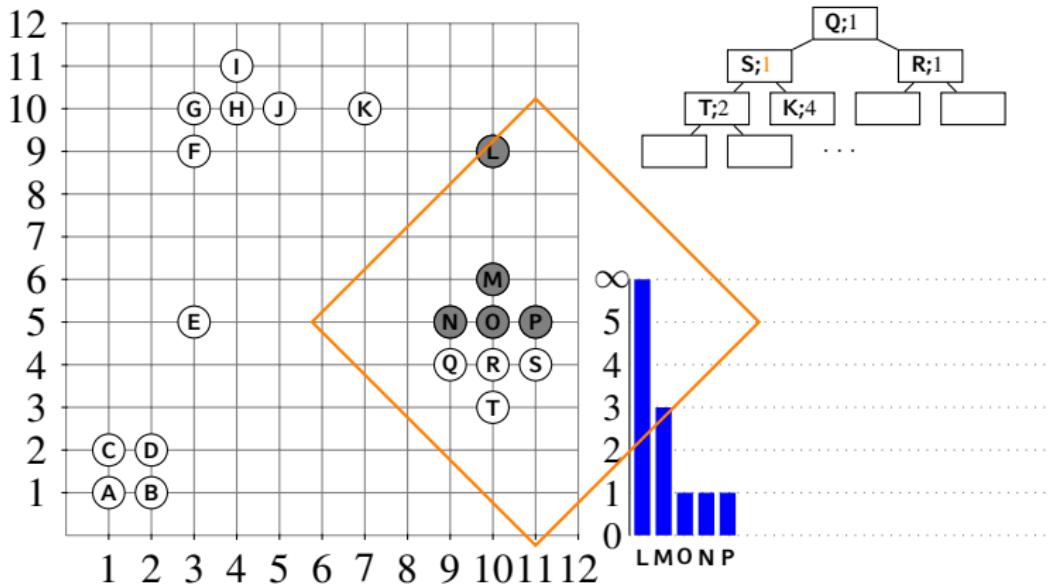
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
 $\text{minPts} = 2$ $\varepsilon = 5$,
 $\text{minPts} = 4$ $\varepsilon = 2$,
 $\text{minPts} = 4$

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

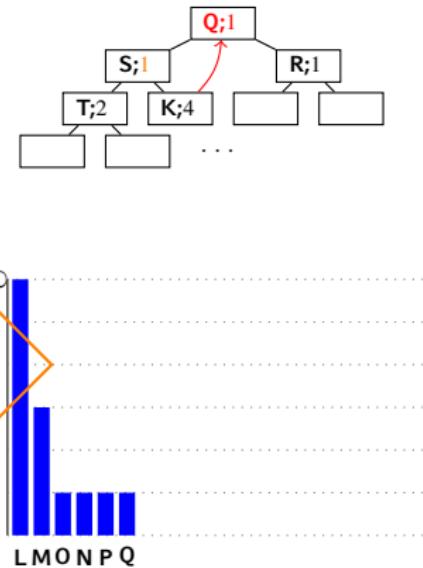
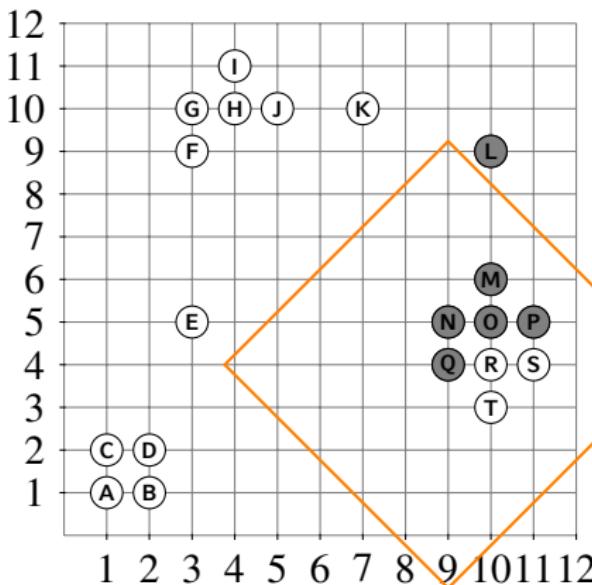
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

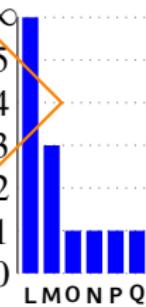
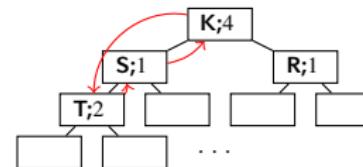
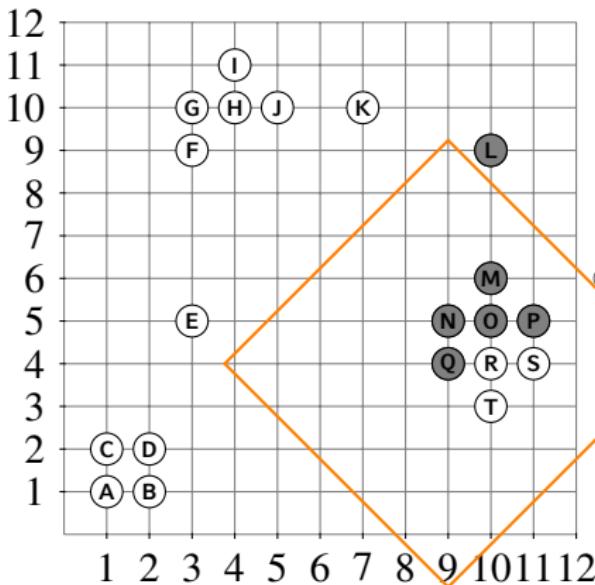
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
 $\text{minPts} = 2$ $\varepsilon = 5$,
 $\text{minPts} = 4$ $\varepsilon = 2$,
 $\text{minPts} = 4$

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

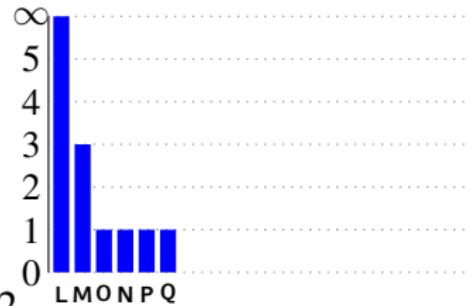
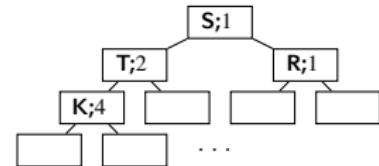
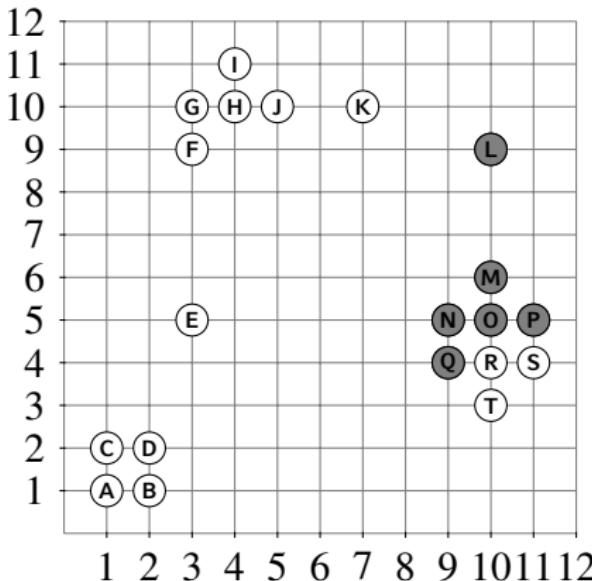
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

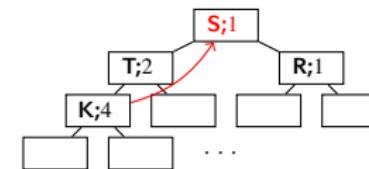
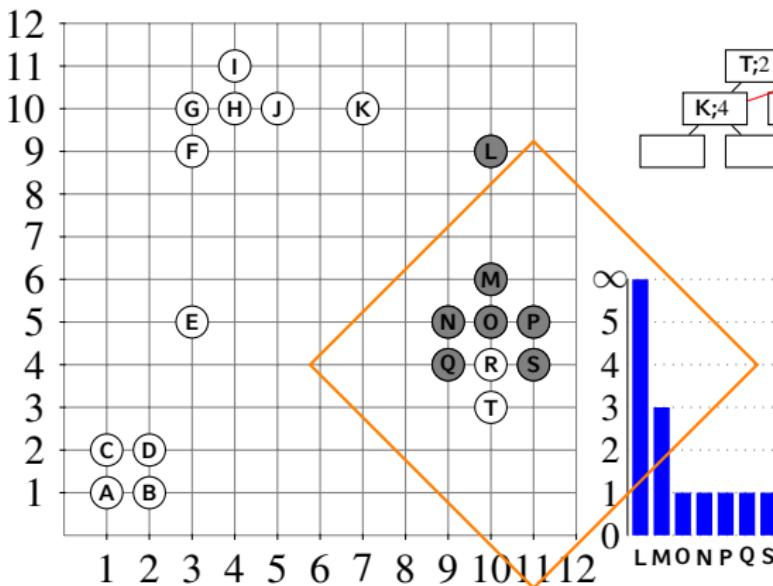
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
 $\text{minPts} = 2$ $\varepsilon = 5$,
 $\text{minPts} = 4$ $\varepsilon = 2$,
 $\text{minPts} = 4$

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

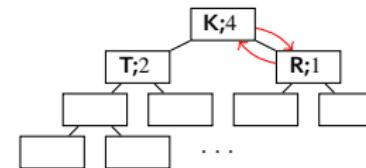
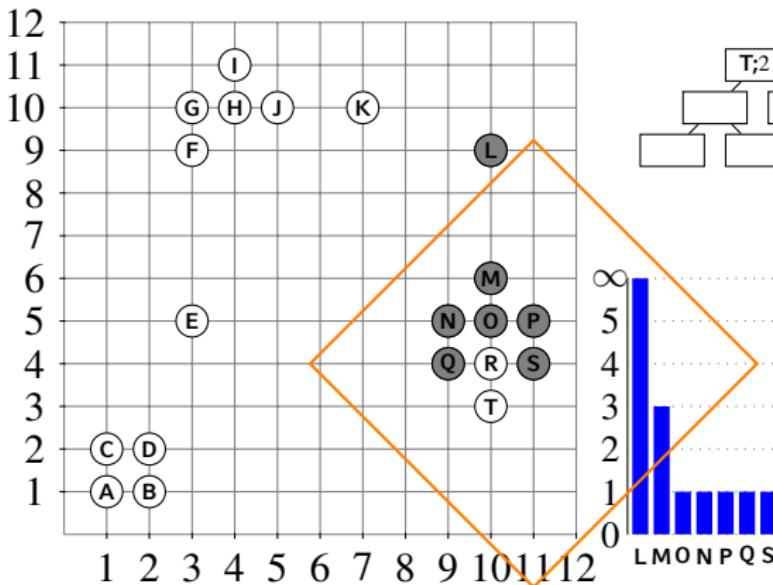
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
 $\text{minPts} = 2$ $\varepsilon = 5$,
 $\text{minPts} = 4$ $\varepsilon = 2$,
 $\text{minPts} = 4$

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

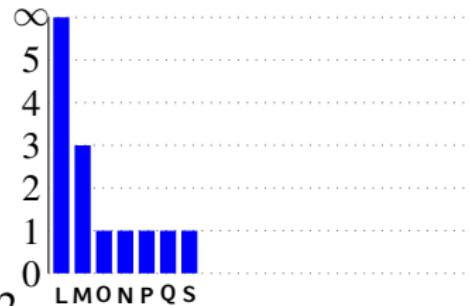
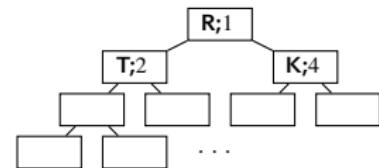
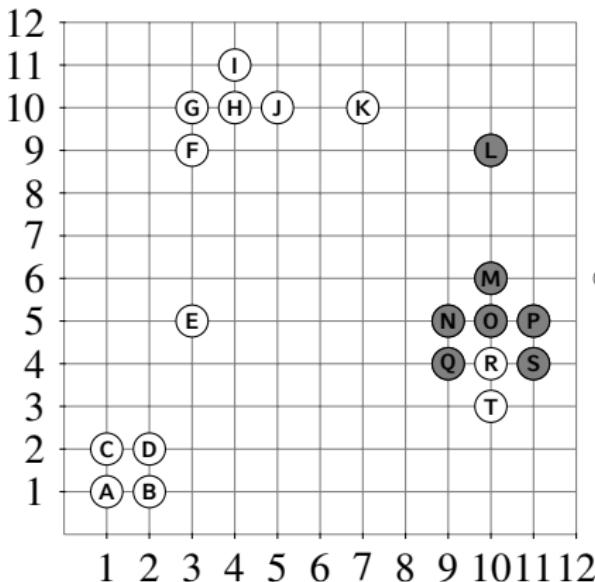
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

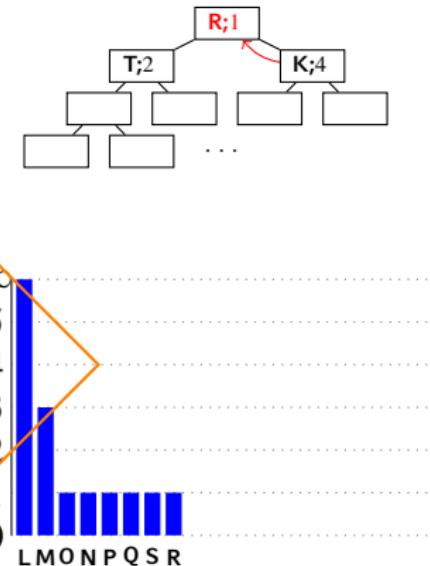
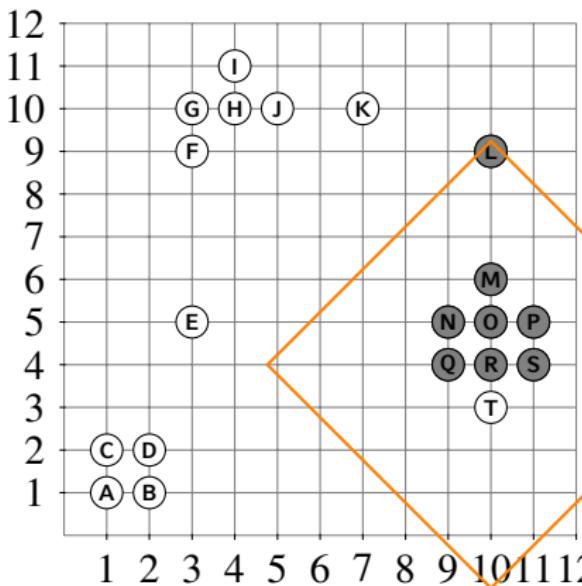
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts= 2 $\varepsilon = 5$,
minPts= 4 $\varepsilon = 2$,
minPts= 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

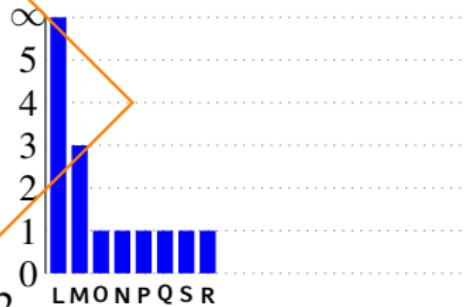
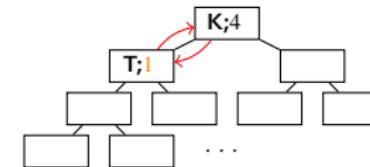
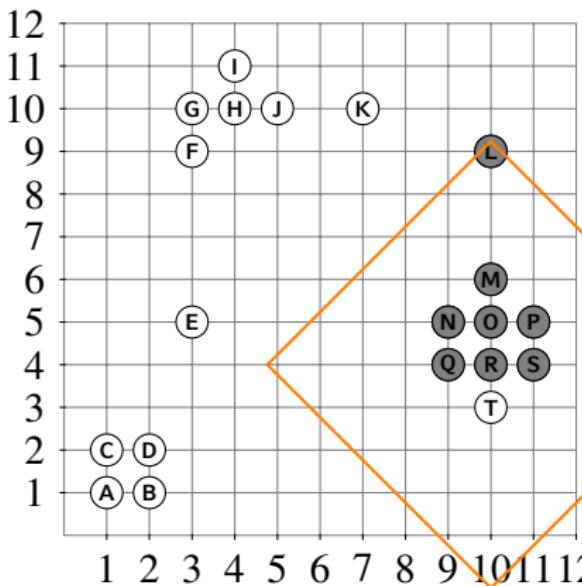
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts= 2 $\varepsilon = 5$,
minPts= 4 $\varepsilon = 2$,
minPts= 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

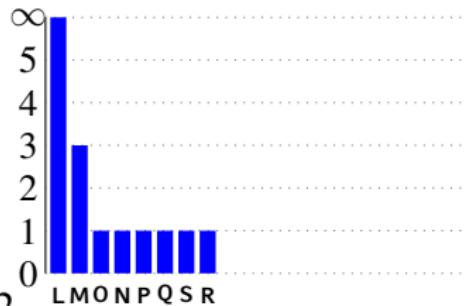
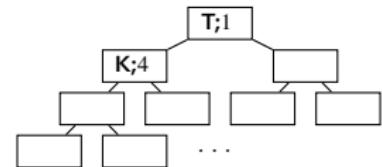
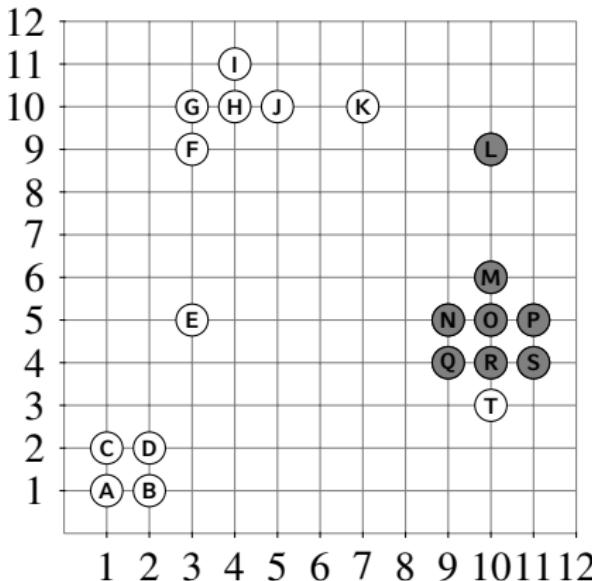
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

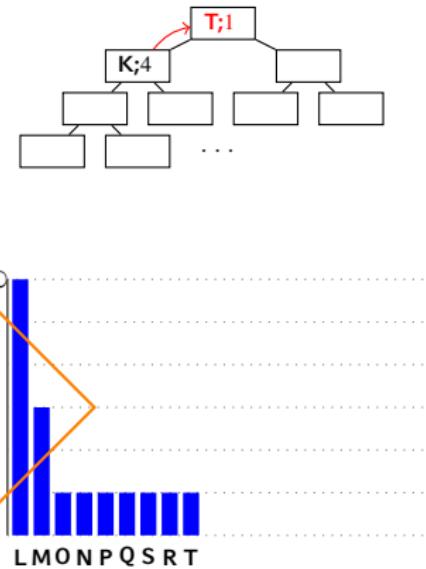
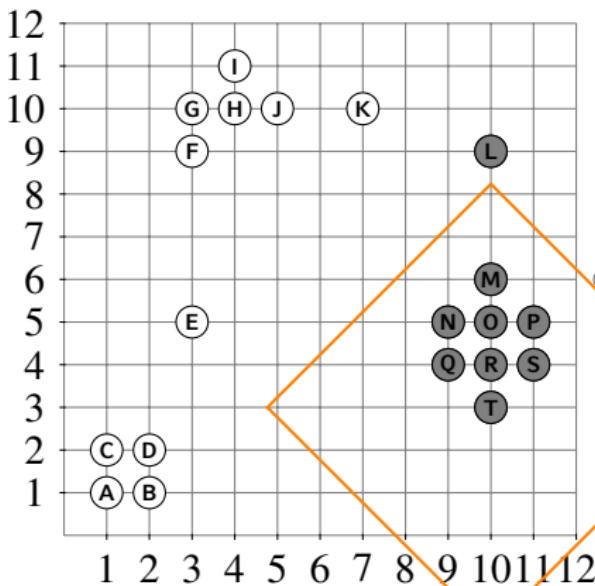
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

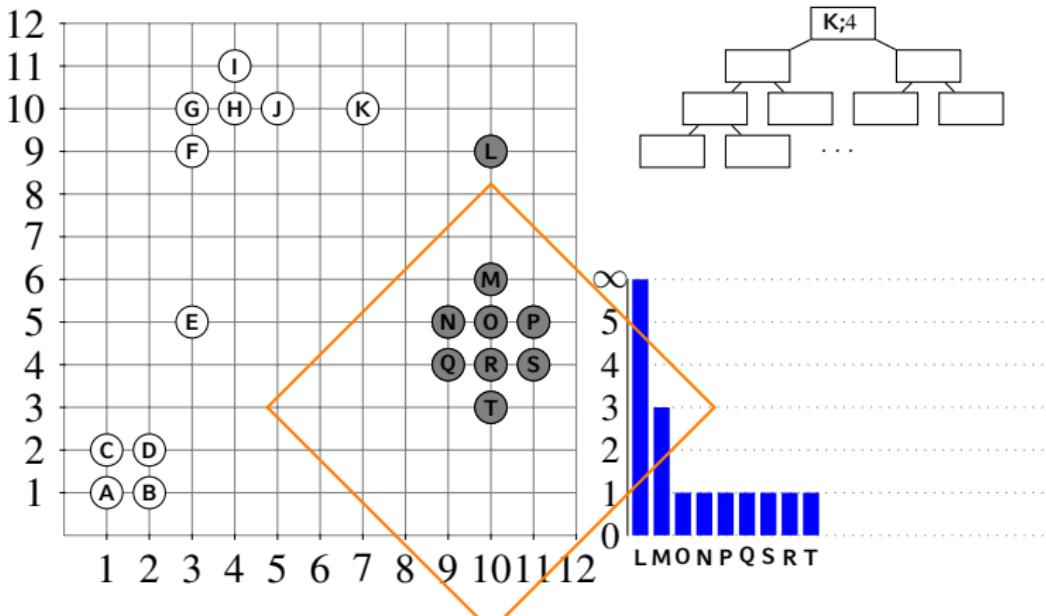
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\epsilon = 5$,
 $\text{minPts} = 2$ $\epsilon = 5$,
 $\text{minPts} = 4$ $\epsilon = 2$,
 $\text{minPts} = 4$

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

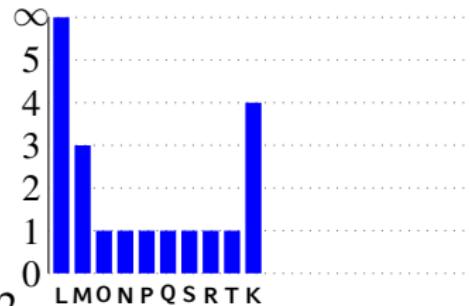
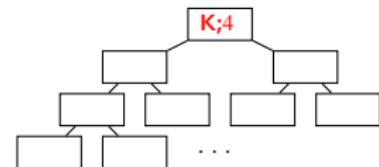
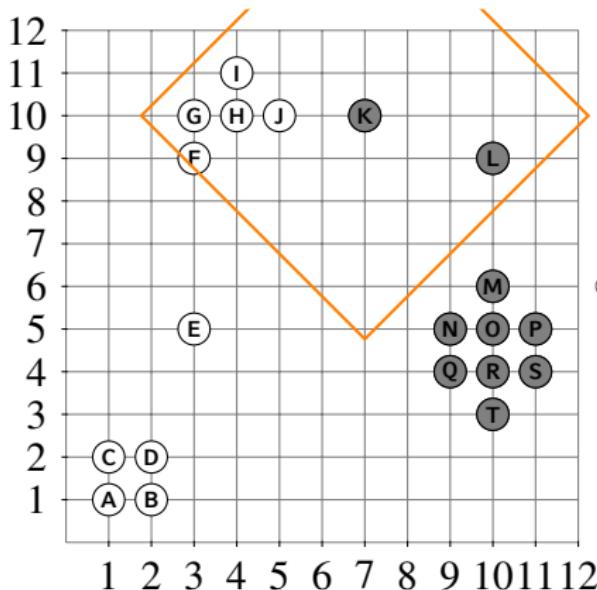
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
 $\text{minPts} = 2$ $\varepsilon = 5$,
 $\text{minPts} = 4$ $\varepsilon = 2$,
 $\text{minPts} = 4$

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

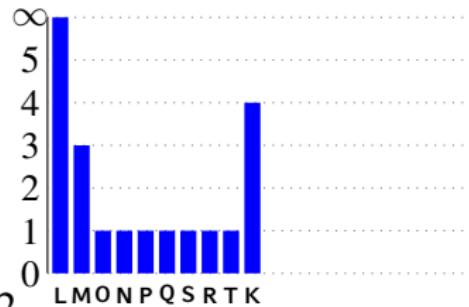
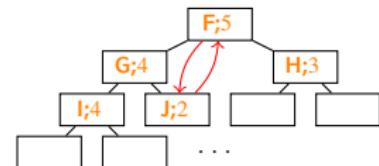
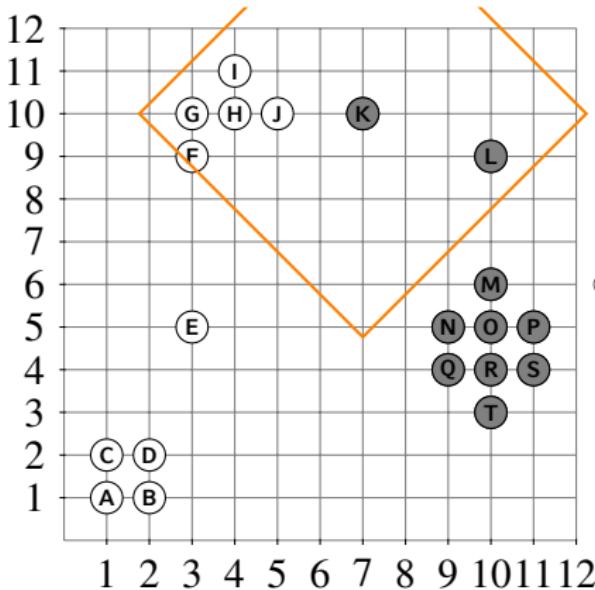
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
 $\text{minPts} = 2$ $\varepsilon = 5$,
 $\text{minPts} = 4$ $\varepsilon = 2$,
 $\text{minPts} = 4$

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

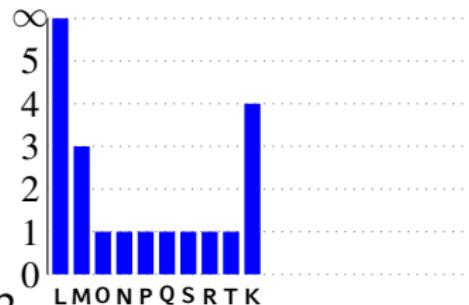
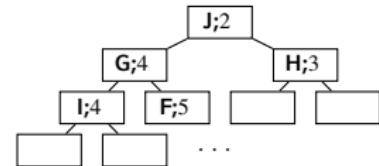
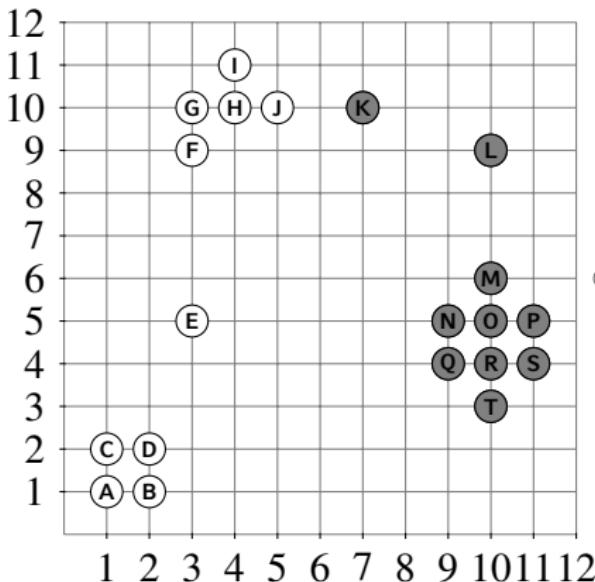
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

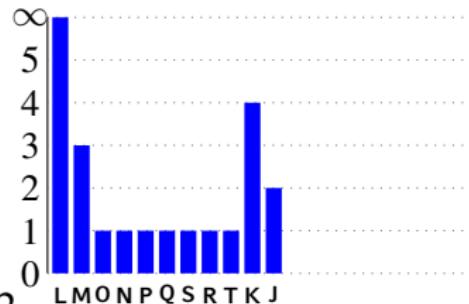
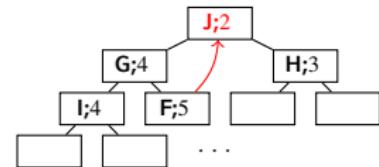
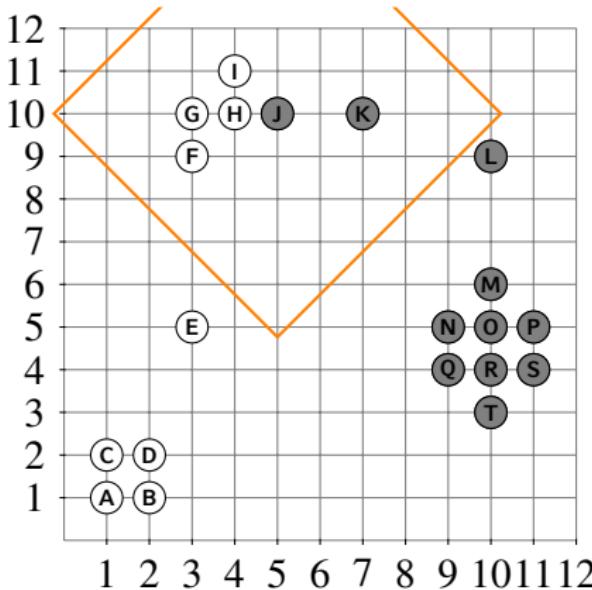
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

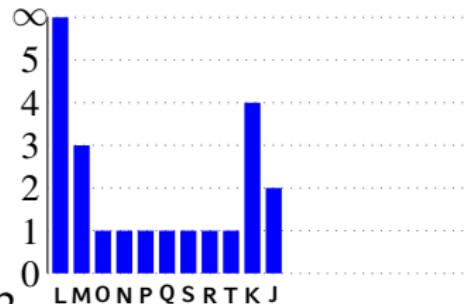
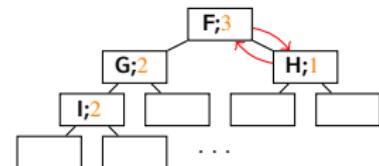
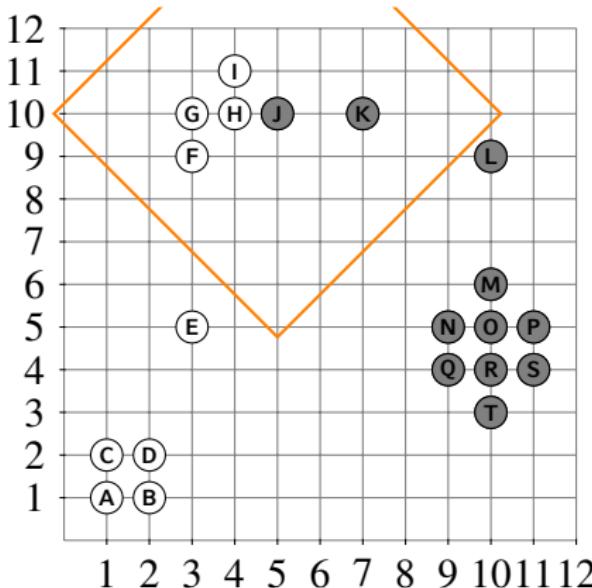
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
 $\text{minPts} = 2$ $\varepsilon = 5$,
 $\text{minPts} = 4$ $\varepsilon = 2$,
 $\text{minPts} = 4$

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

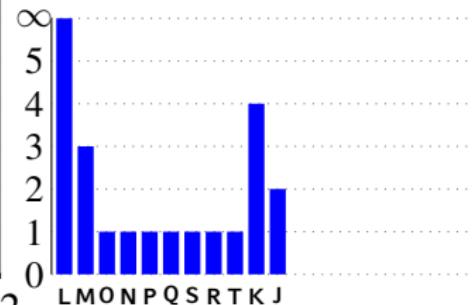
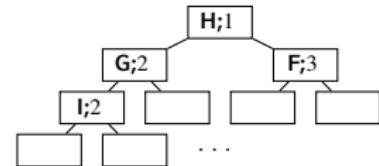
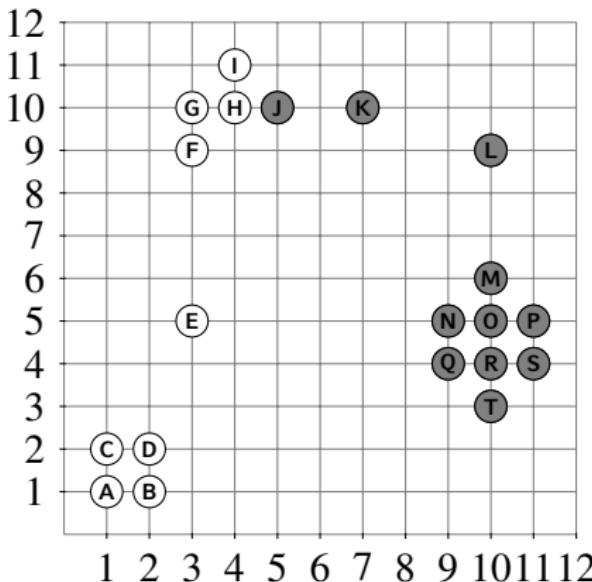
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\epsilon = 5$,
 $\text{minPts} = 2$ $\epsilon = 5$,
 $\text{minPts} = 4$ $\epsilon = 2$,
 $\text{minPts} = 4$

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

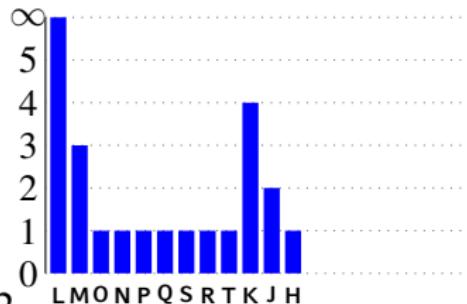
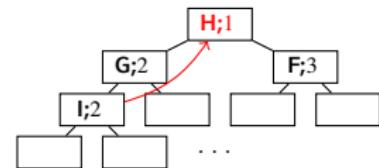
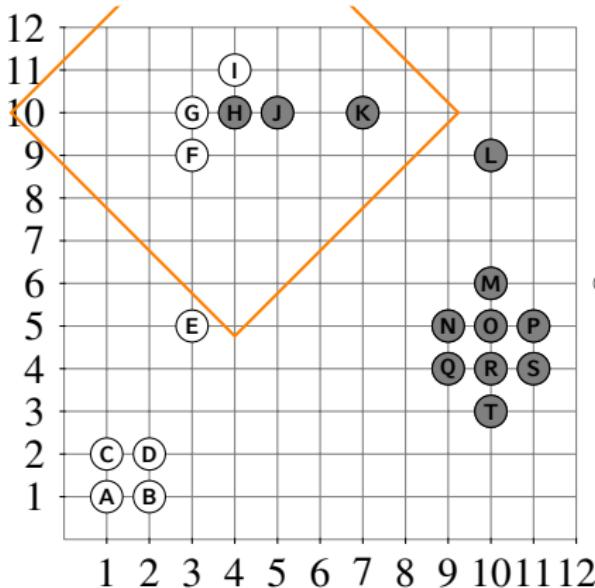
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

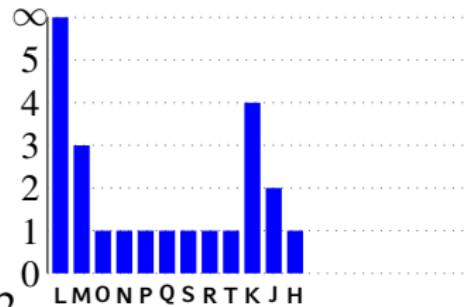
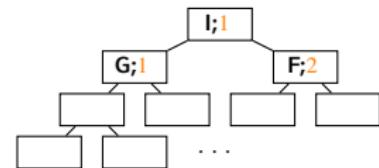
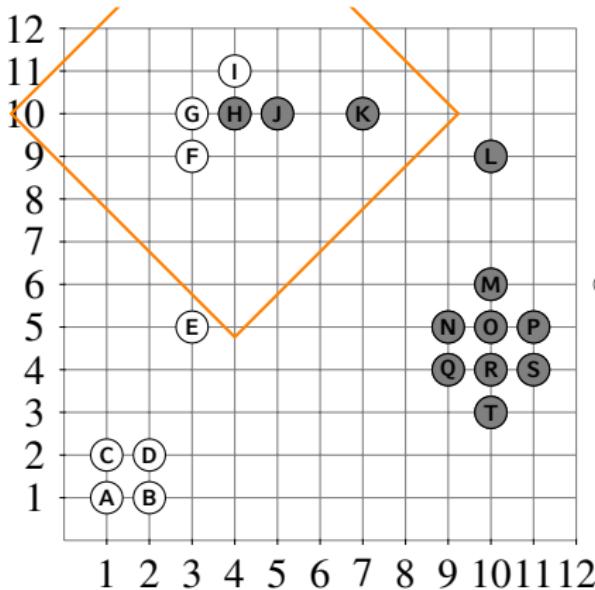
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

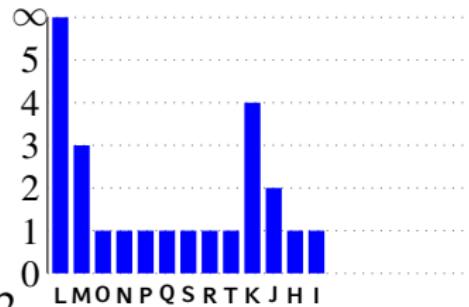
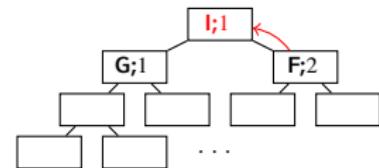
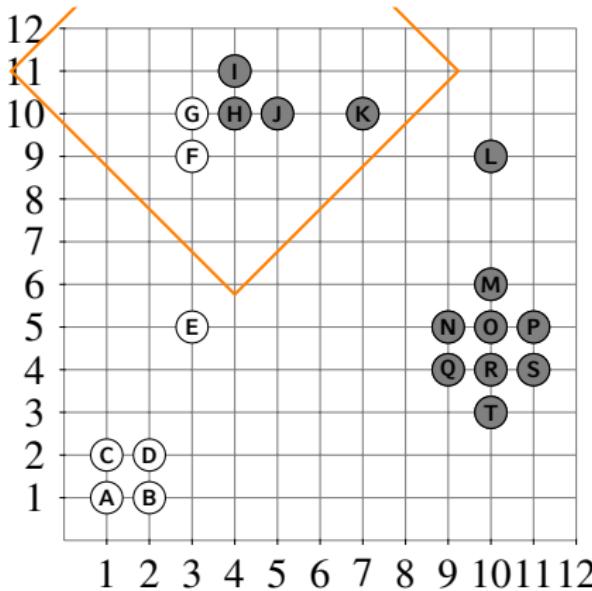
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
 $\text{minPts} = 2$ $\varepsilon = 5$,
 $\text{minPts} = 4$ $\varepsilon = 2$,
 $\text{minPts} = 4$

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

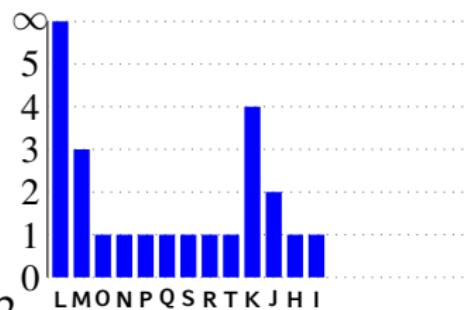
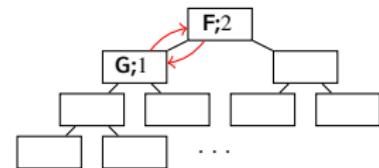
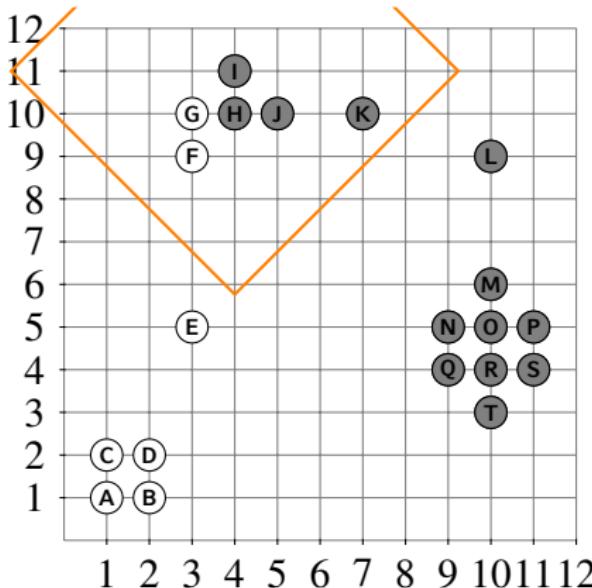
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
 $\text{minPts} = 2$ $\varepsilon = 5$,
 $\text{minPts} = 4$ $\varepsilon = 2$,
 $\text{minPts} = 4$

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

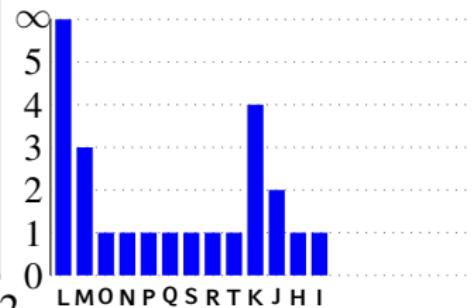
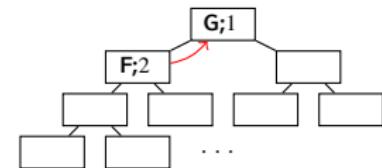
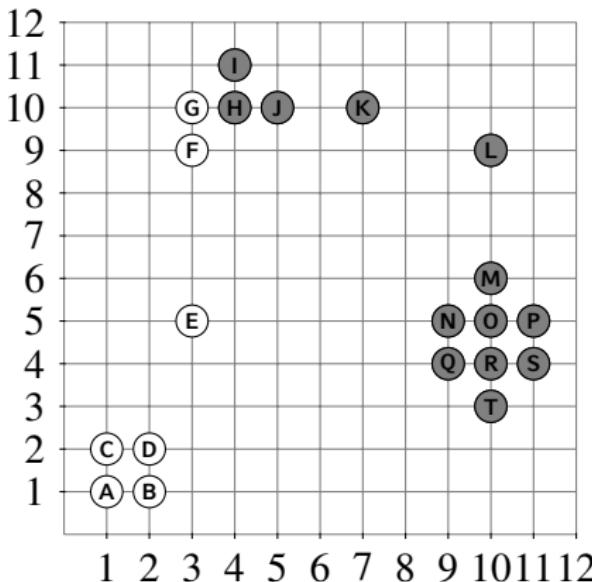
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

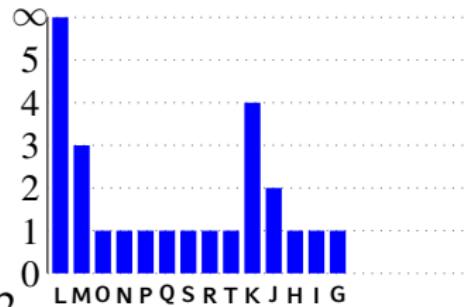
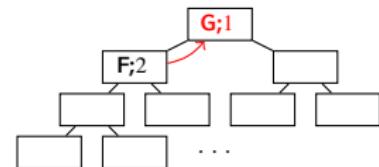
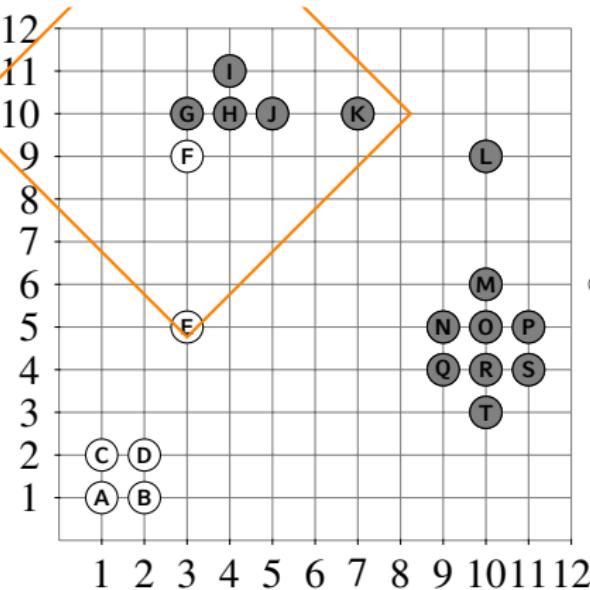
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
 $\text{minPts} = 2$ $\varepsilon = 5$,
 $\text{minPts} = 4$ $\varepsilon = 2$,
 $\text{minPts} = 4$

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

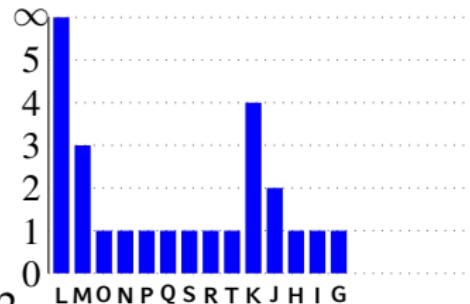
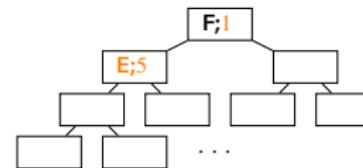
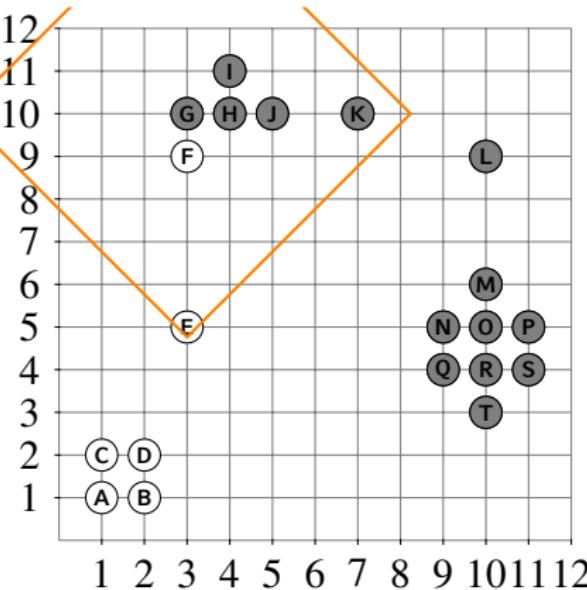
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
 $\text{minPts} = 2$ $\varepsilon = 5$,
 $\text{minPts} = 4$ $\varepsilon = 2$,
 $\text{minPts} = 4$

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

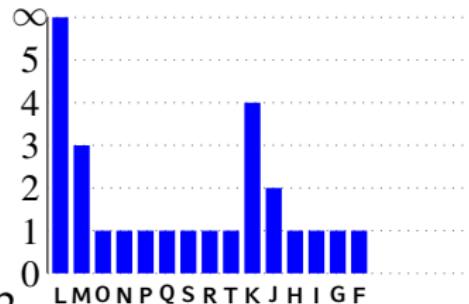
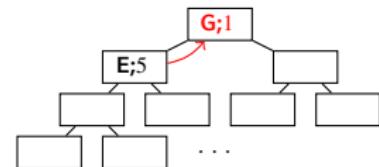
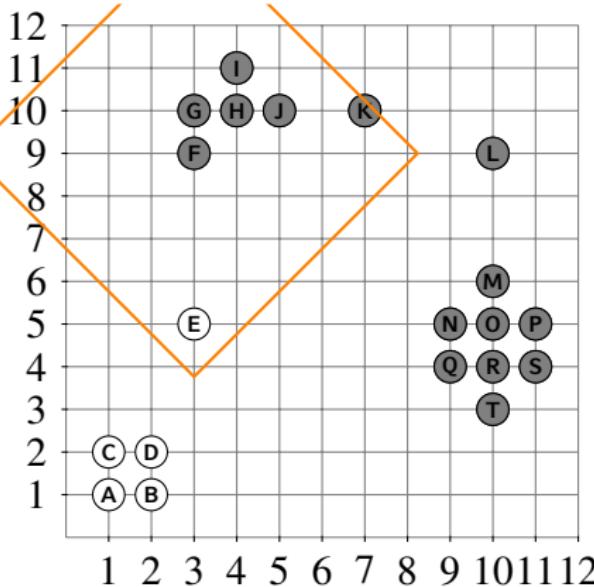
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
 $\text{minPts} = 2$ $\varepsilon = 5$,
 $\text{minPts} = 4$ $\varepsilon = 2$,
 $\text{minPts} = 4$

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

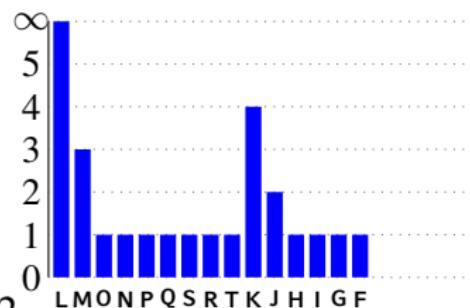
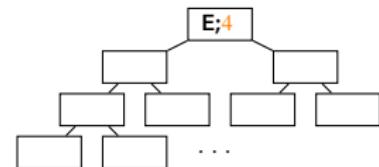
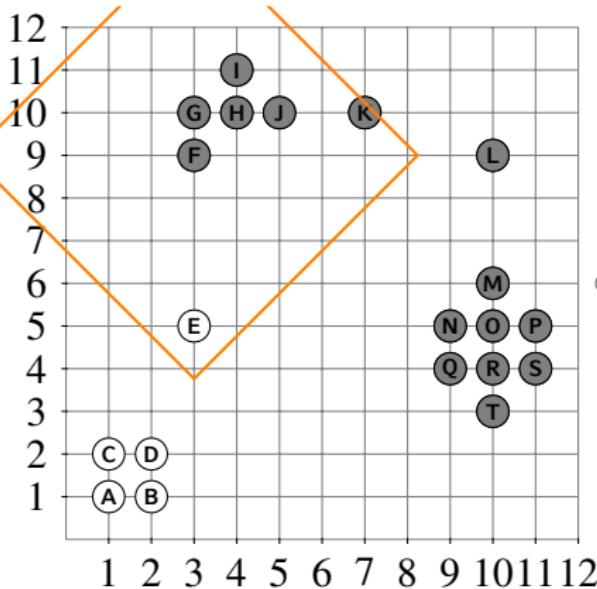
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
 $\text{minPts} = 2$ $\varepsilon = 5$,
 $\text{minPts} = 4$ $\varepsilon = 2$,
 $\text{minPts} = 4$

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

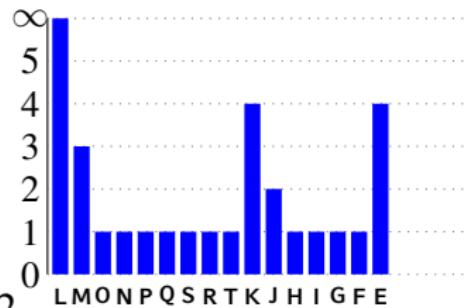
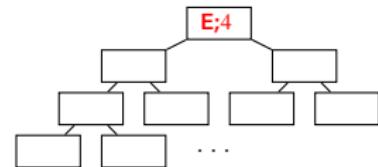
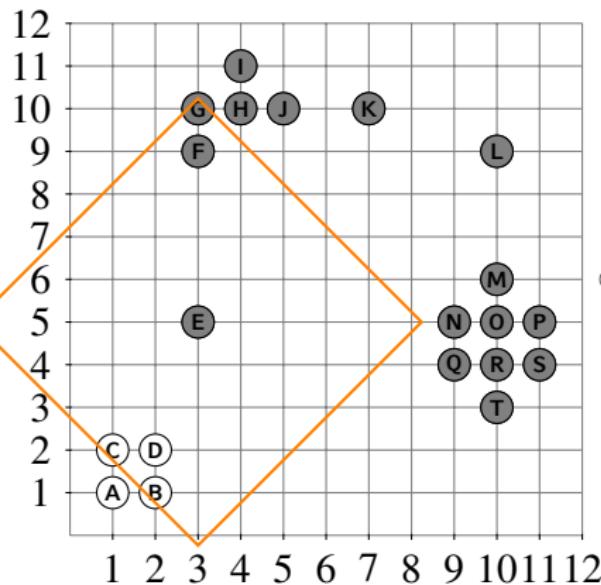
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

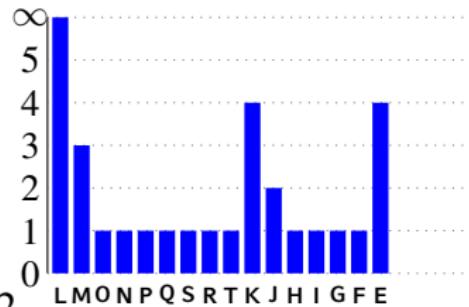
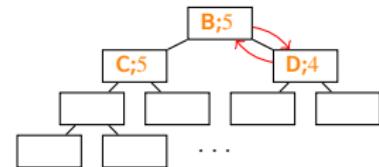
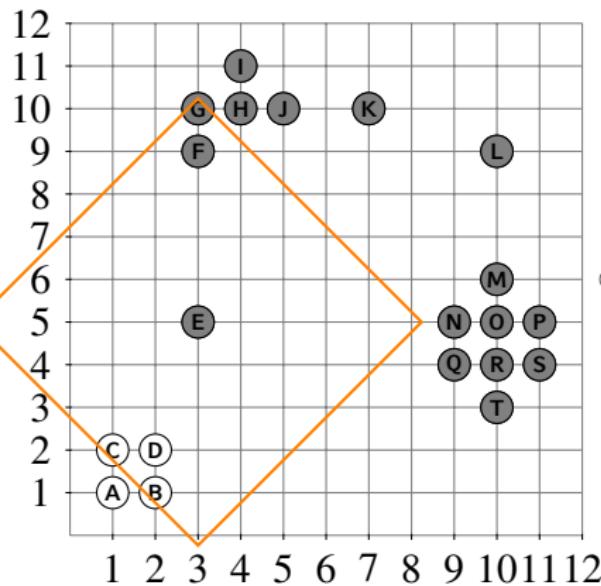
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
 $\text{minPts} = 2$ $\varepsilon = 5$,
 $\text{minPts} = 4$ $\varepsilon = 2$,
 $\text{minPts} = 4$

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

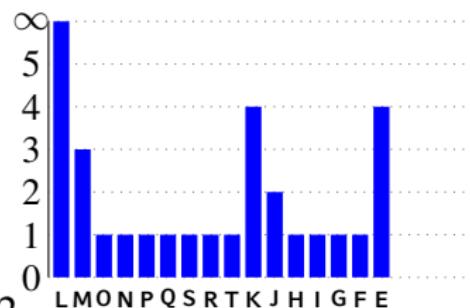
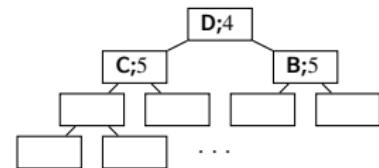
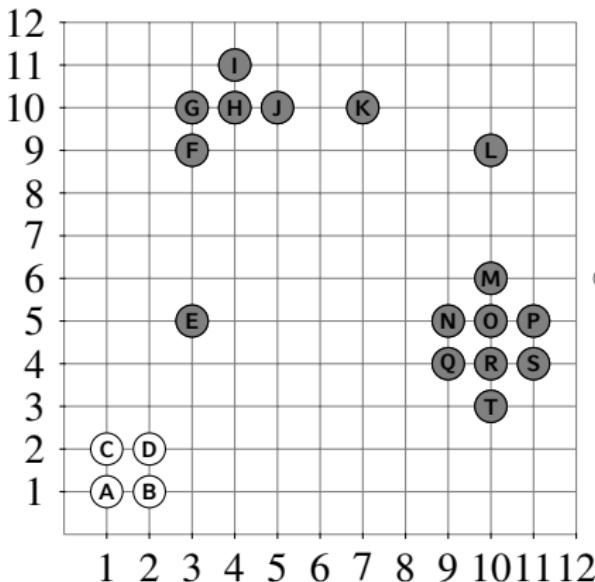
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
 $\text{minPts} = 2$ $\varepsilon = 5$,
 $\text{minPts} = 4$ $\varepsilon = 2$,
 $\text{minPts} = 4$

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

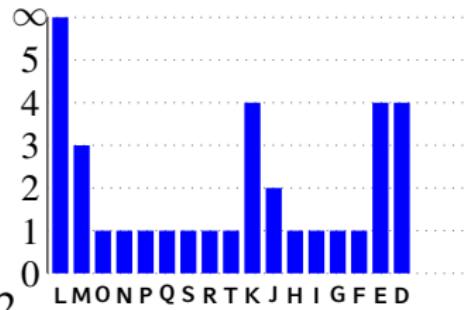
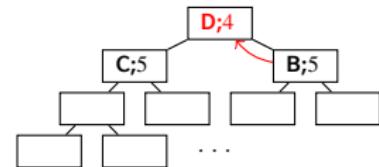
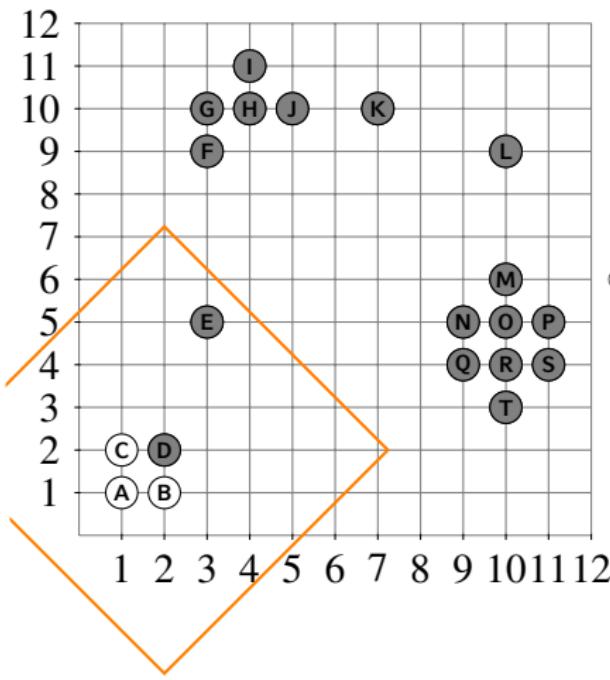
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
 $\text{minPts} = 2$ $\varepsilon = 5$,
 $\text{minPts} = 4$ $\varepsilon = 2$,
 $\text{minPts} = 4$

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

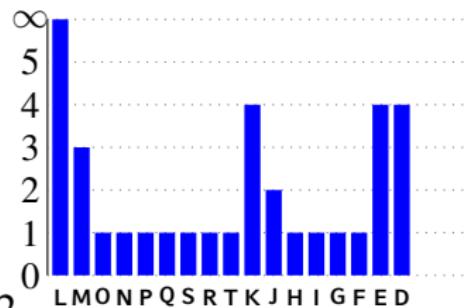
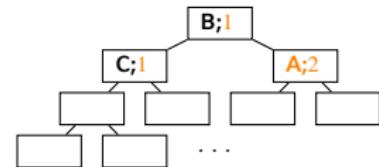
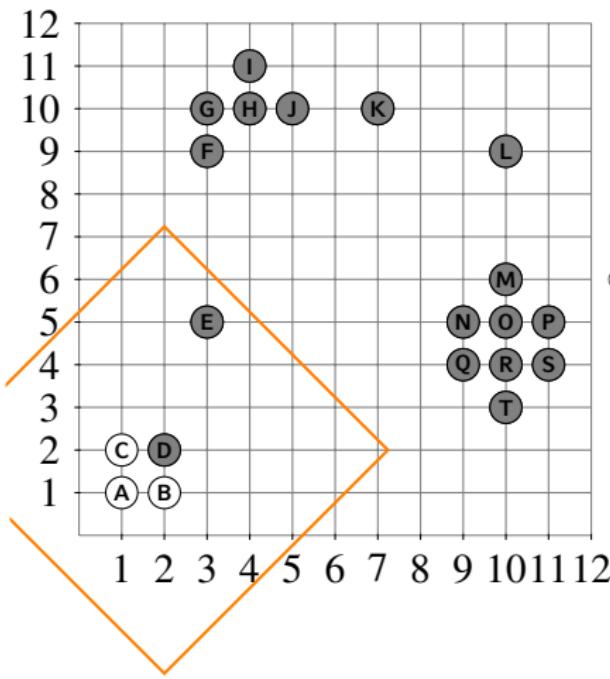
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

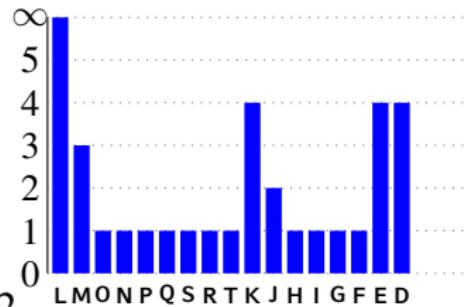
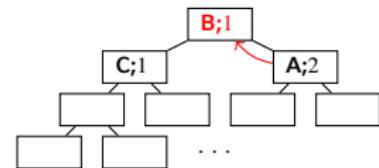
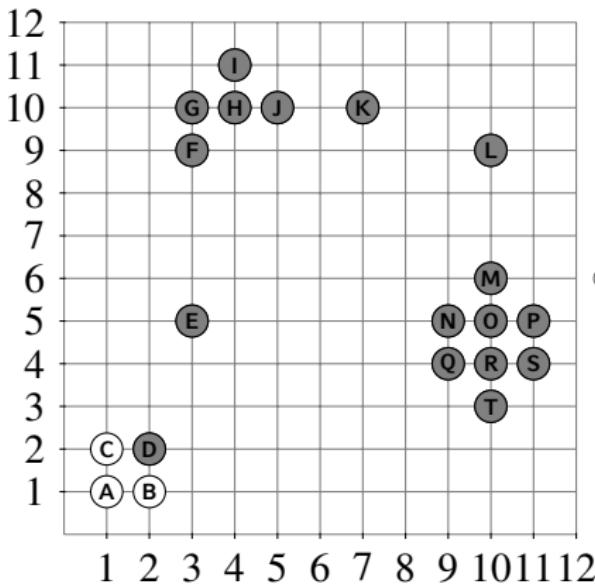
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
 $\text{minPts} = 2$ $\varepsilon = 5$,
 $\text{minPts} = 4$ $\varepsilon = 2$,
 $\text{minPts} = 4$

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

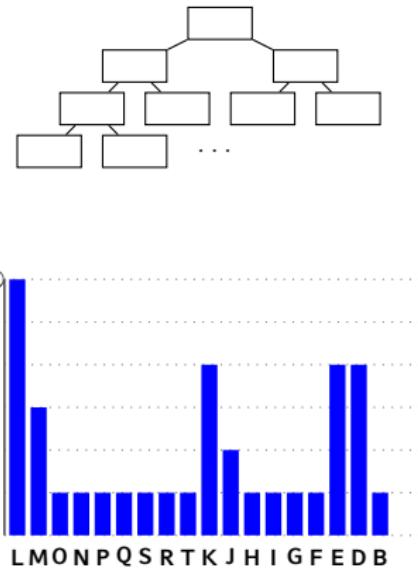
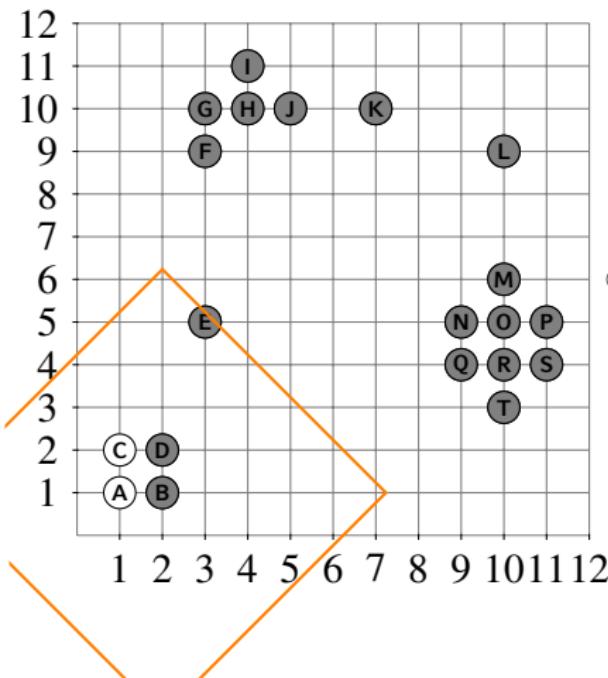
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

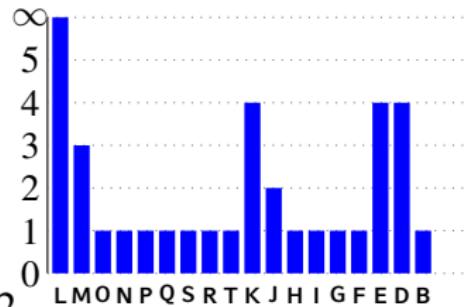
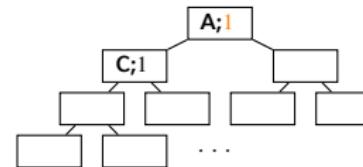
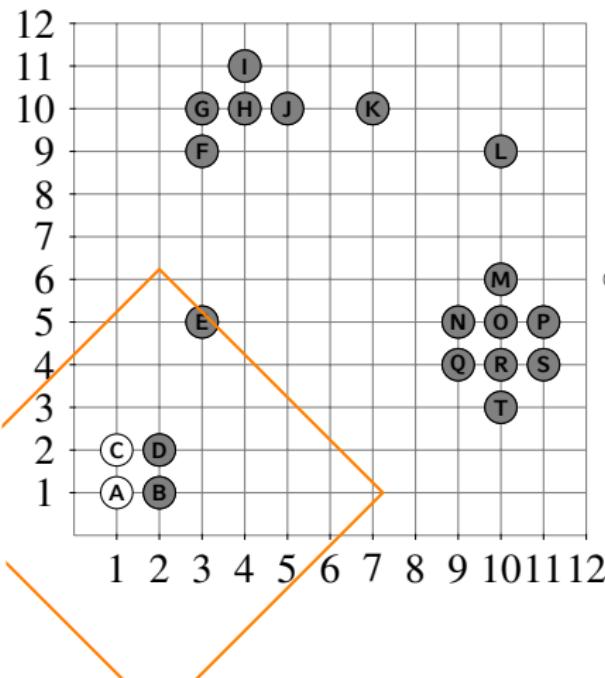
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

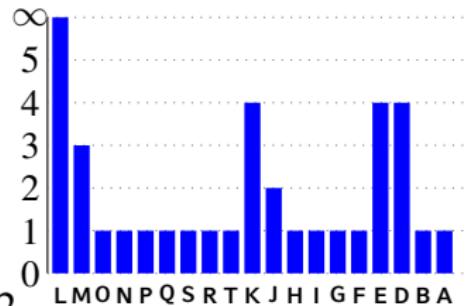
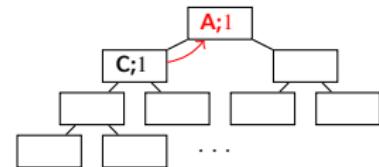
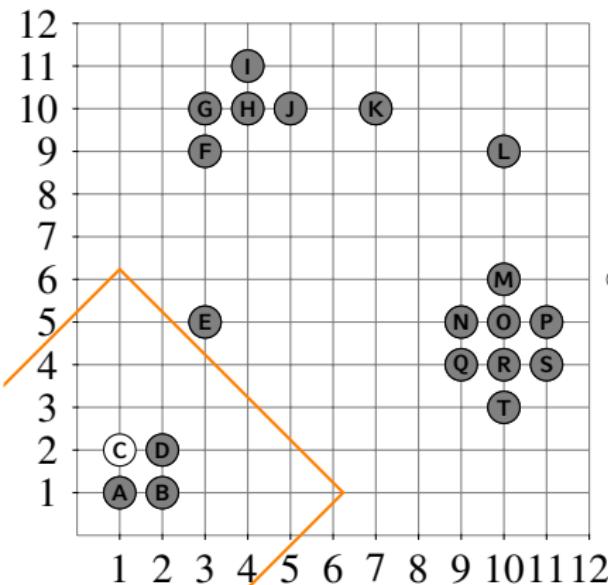
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
 $\text{minPts} = 2$ $\varepsilon = 5$,
 $\text{minPts} = 4$ $\varepsilon = 2$,
 $\text{minPts} = 4$

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

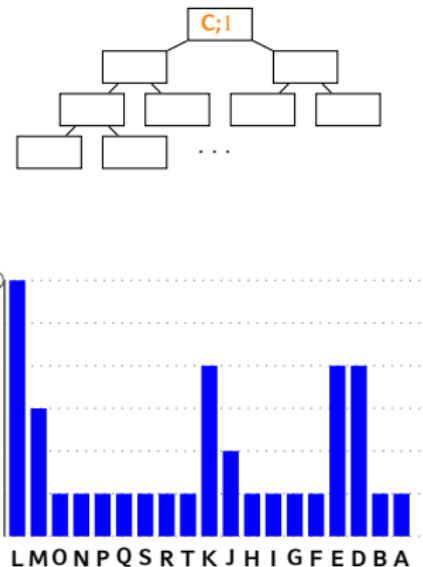
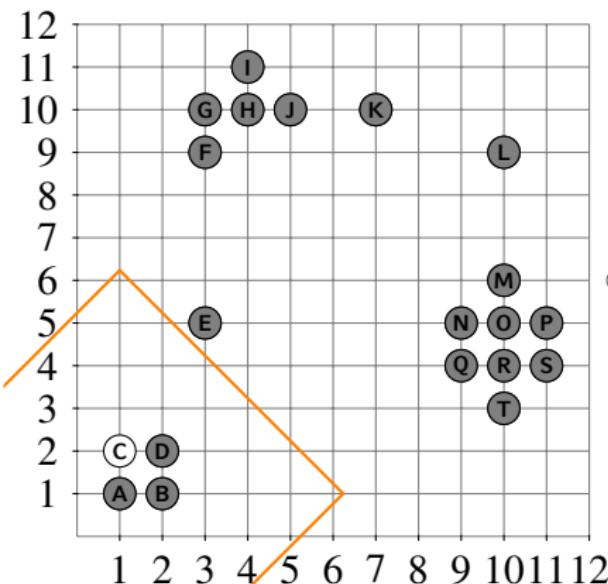
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
 $\text{minPts} = 2$ $\varepsilon = 5$,
 $\text{minPts} = 4$ $\varepsilon = 2$,
 $\text{minPts} = 4$

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

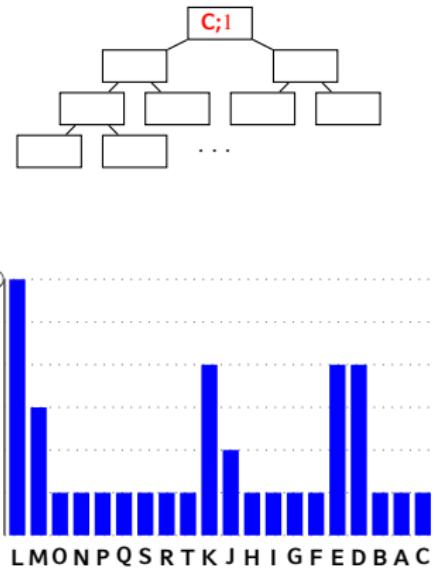
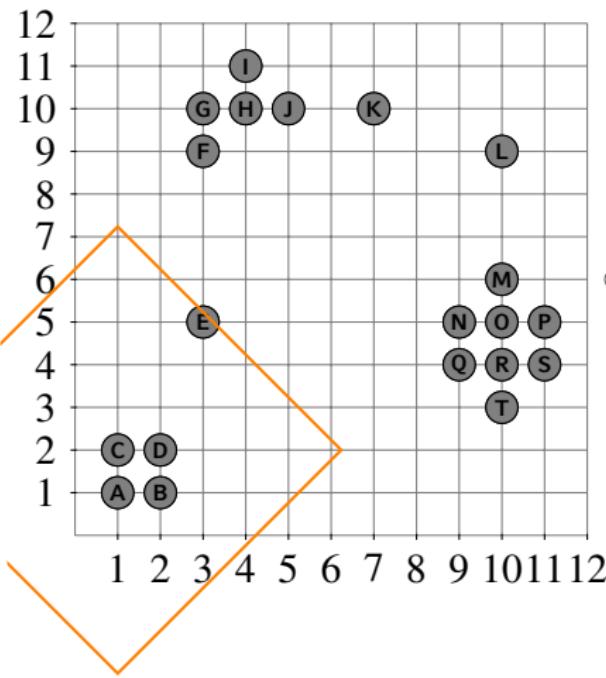
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

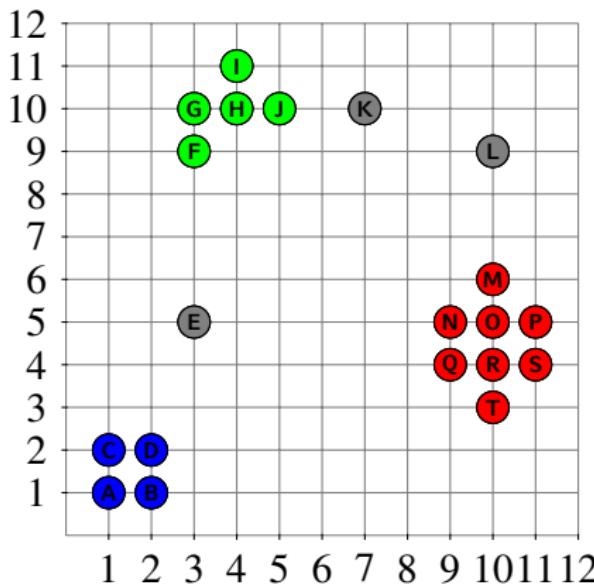
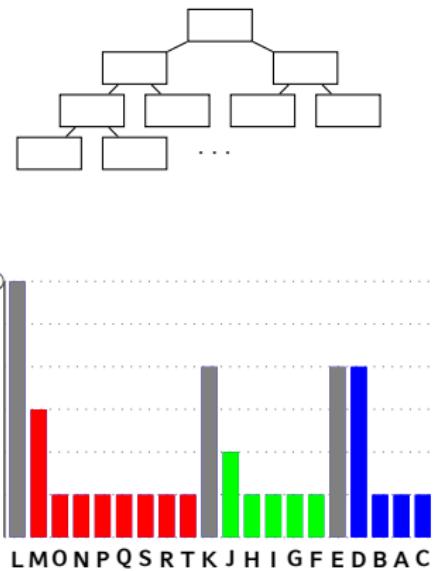
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
 $\text{minPts} = 2$ $\varepsilon = 5$,
 $\text{minPts} = 4$ $\varepsilon = 2$,
 $\text{minPts} = 4$

Vergleich

(Intuitive Cluster \approx Täler)

Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

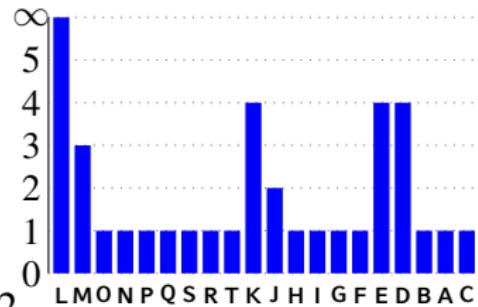
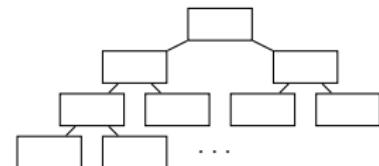
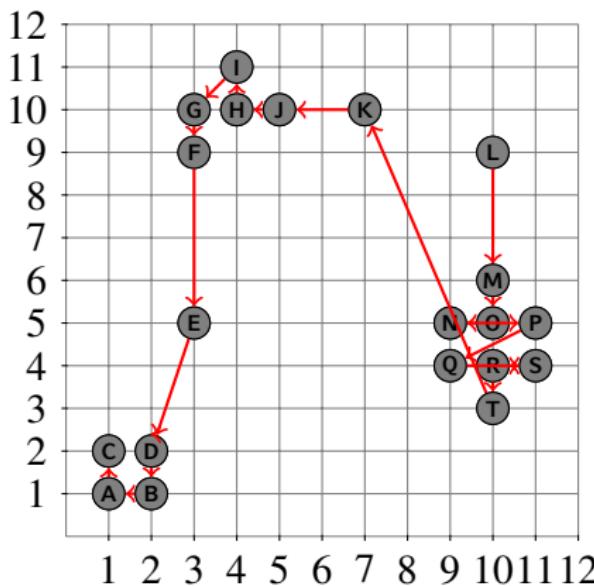
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
 $\text{minPts} = 2$ $\varepsilon = 5$,
 $\text{minPts} = 4$ $\varepsilon = 2$,
 $\text{minPts} = 4$

Vergleich



(Clusterordnung als Graph: springt!)

Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

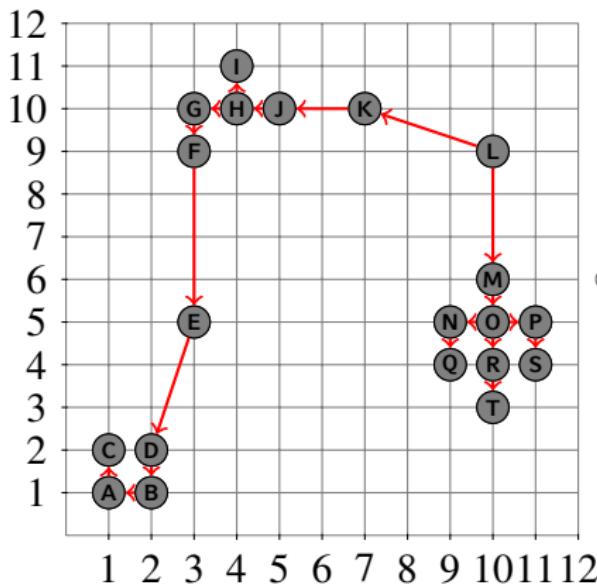
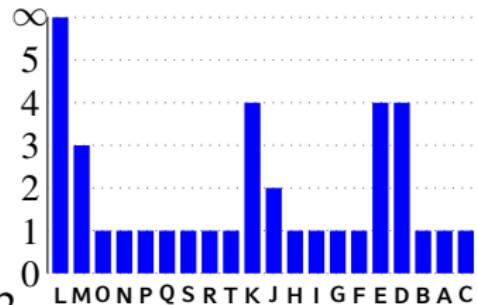
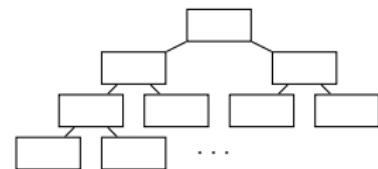
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
 $\text{minPts} = 2$ $\varepsilon = 5$,
 $\text{minPts} = 4$ $\varepsilon = 2$,
 $\text{minPts} = 4$

Vergleich

("Erreicht von" Graph: \approx Spanning Tree)

Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

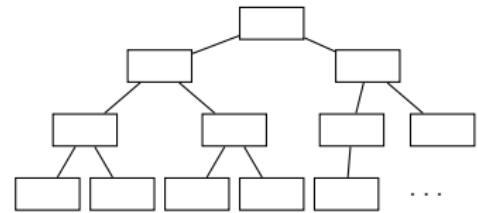
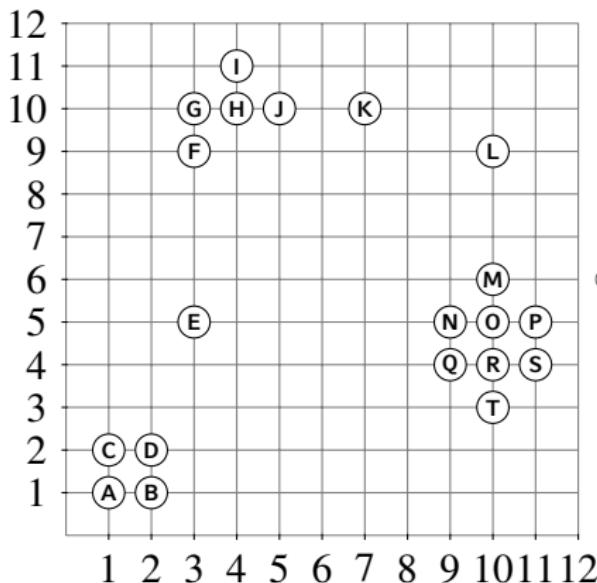
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

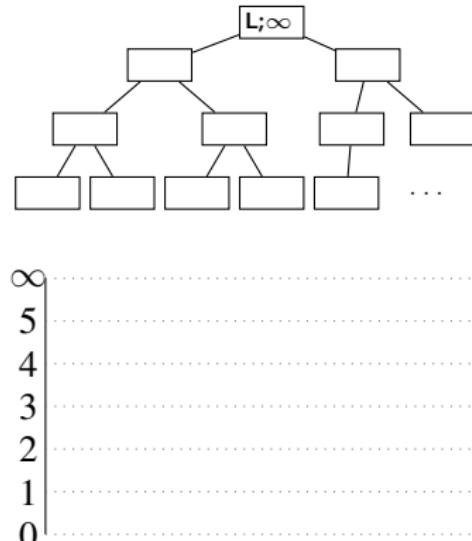
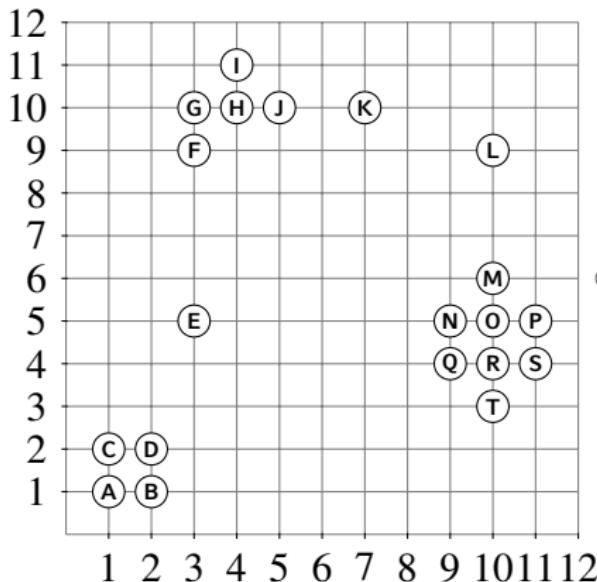
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

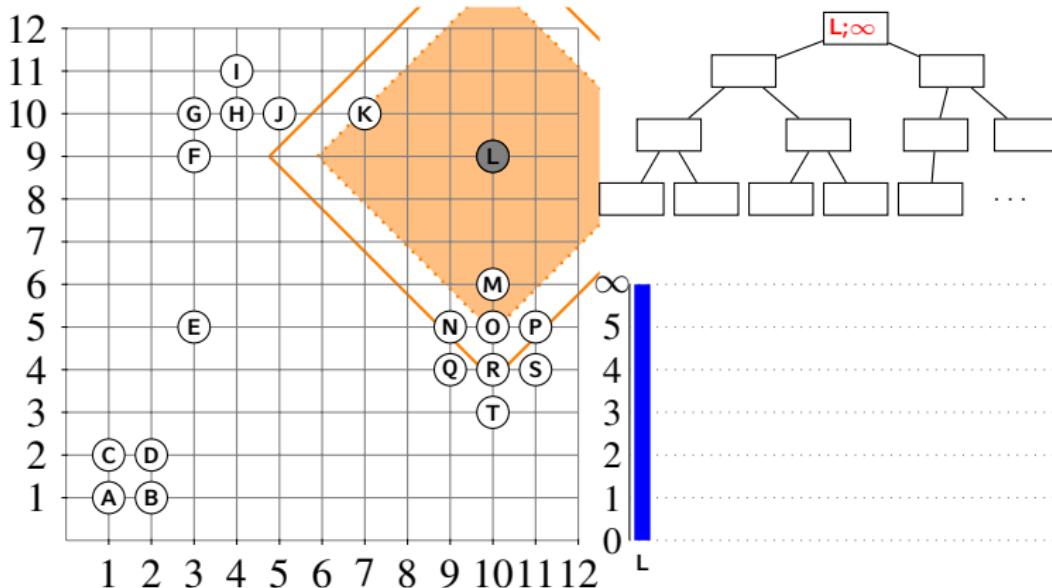
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

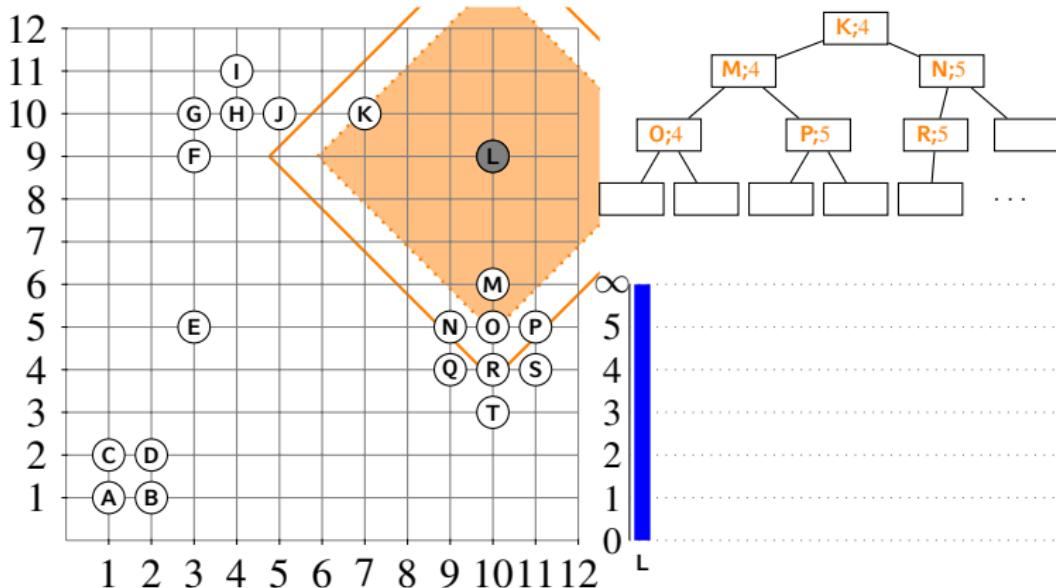
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

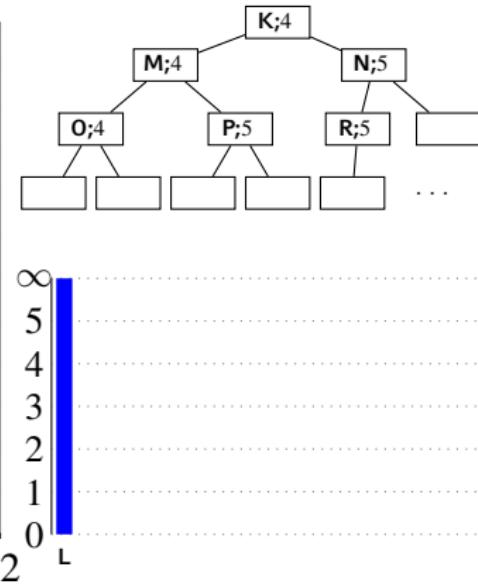
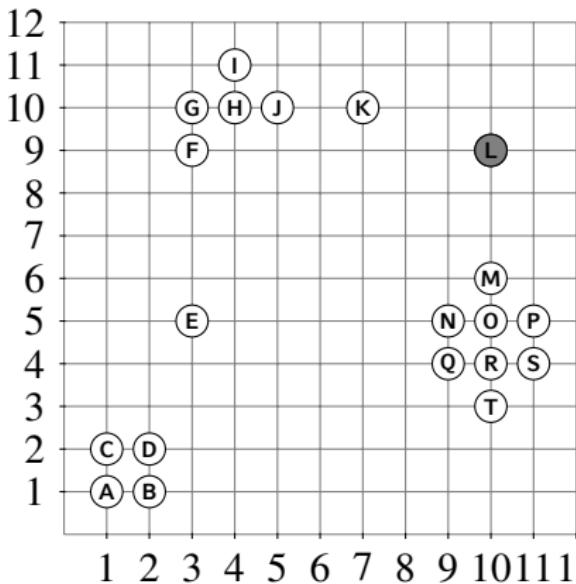
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

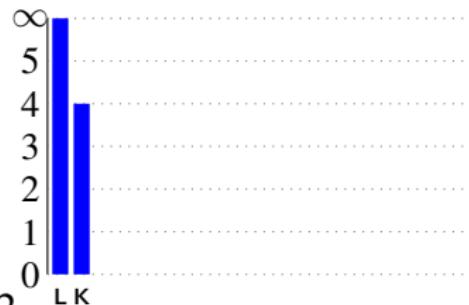
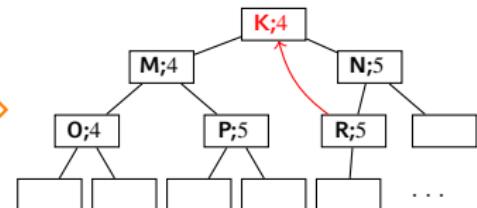
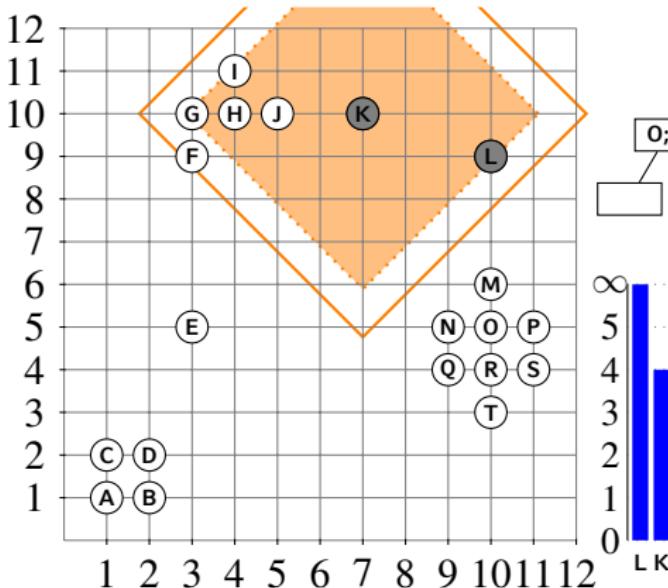
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

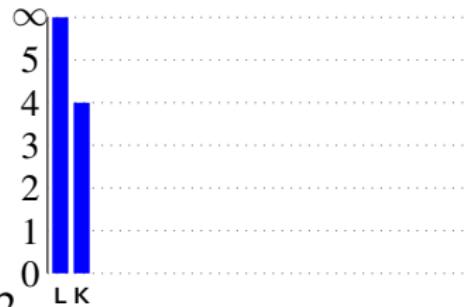
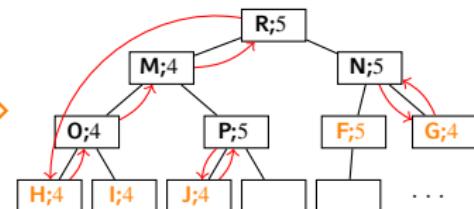
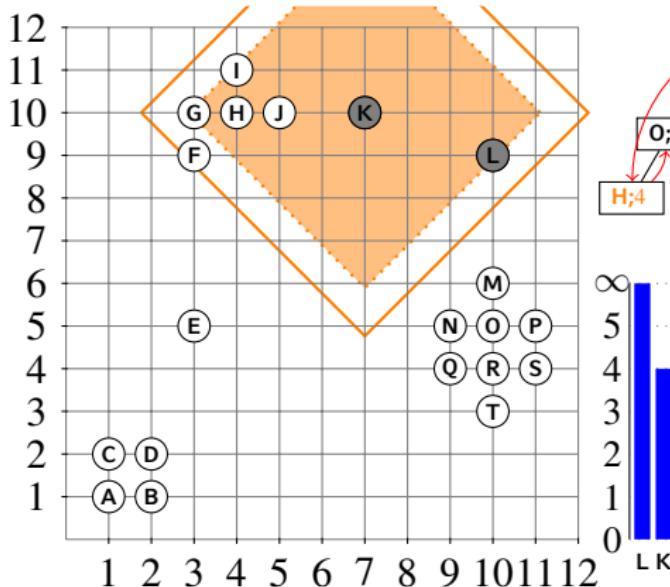
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

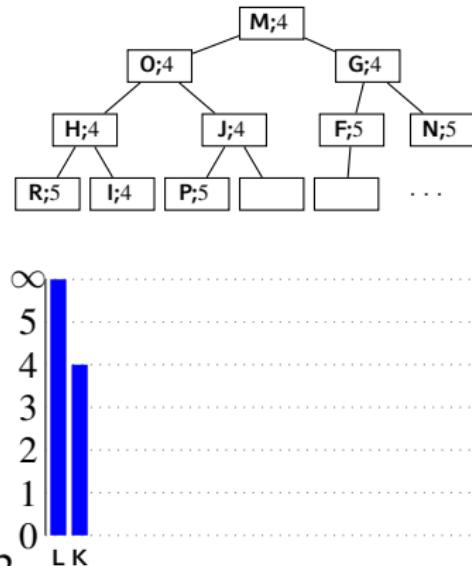
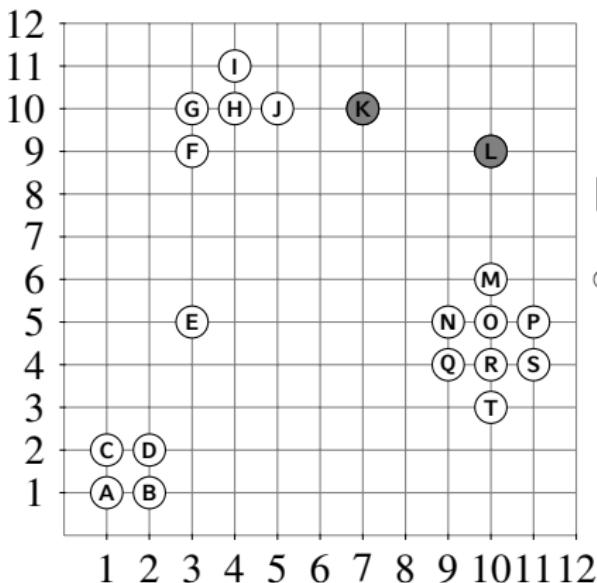
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

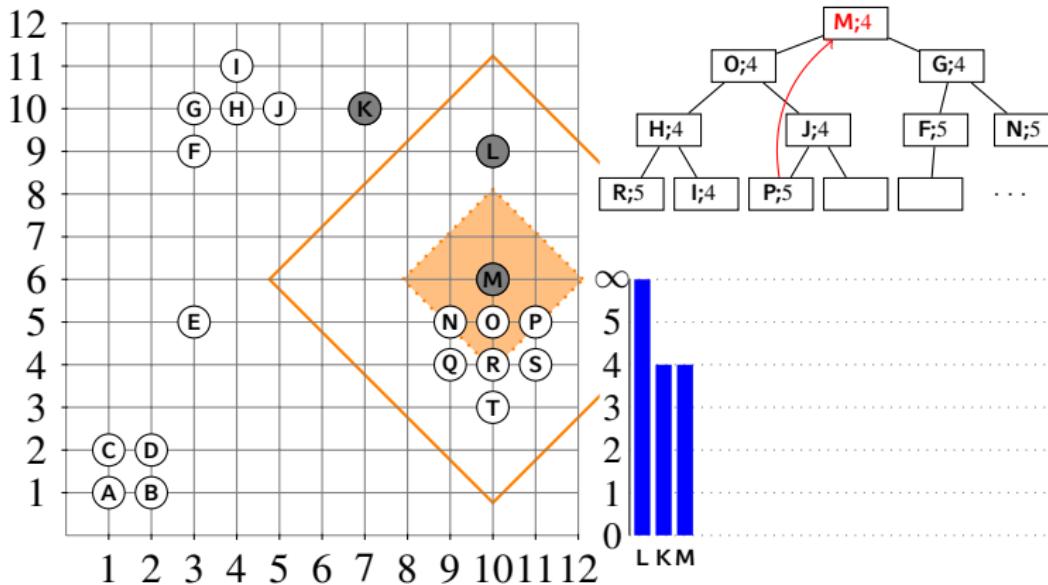
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

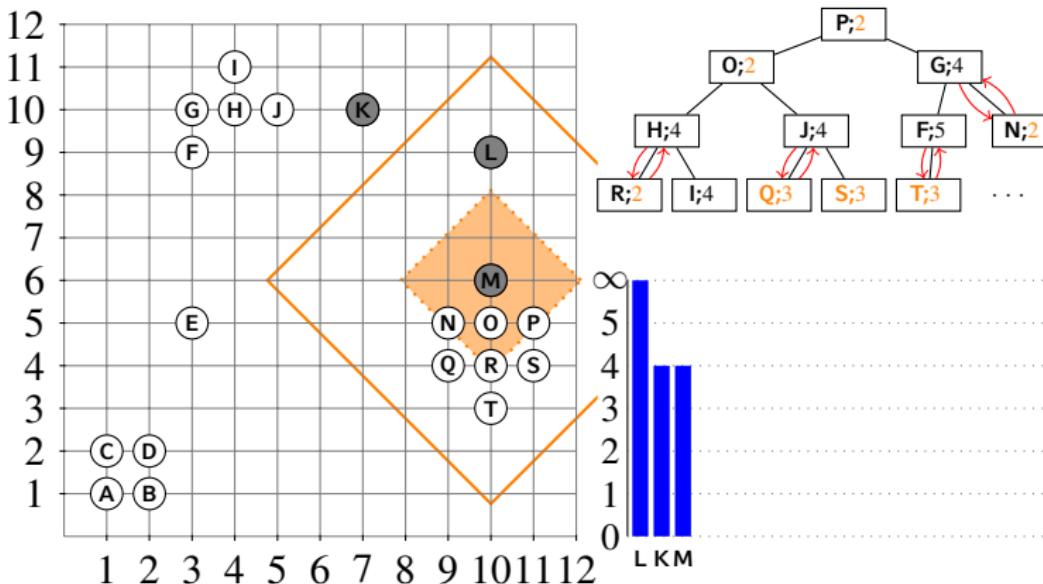
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

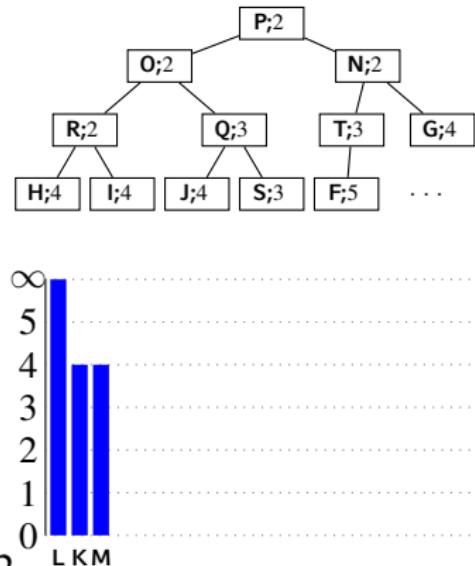
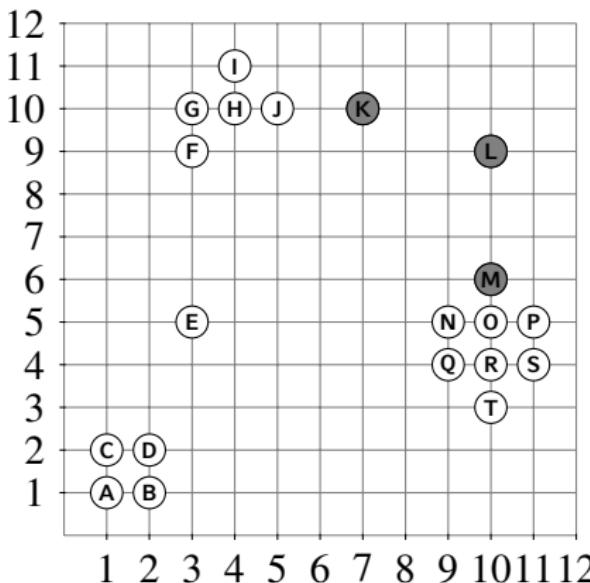
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

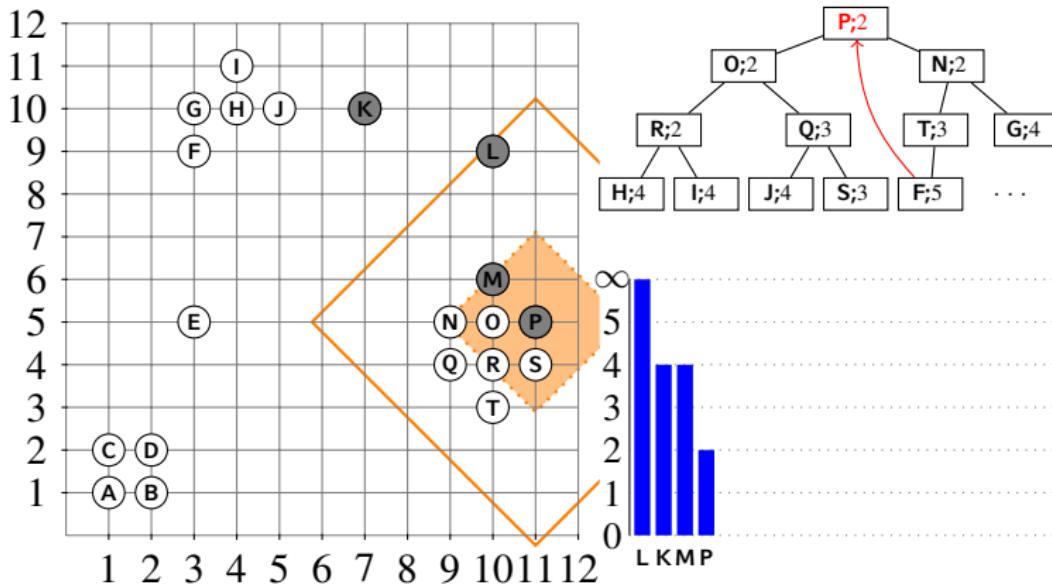
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

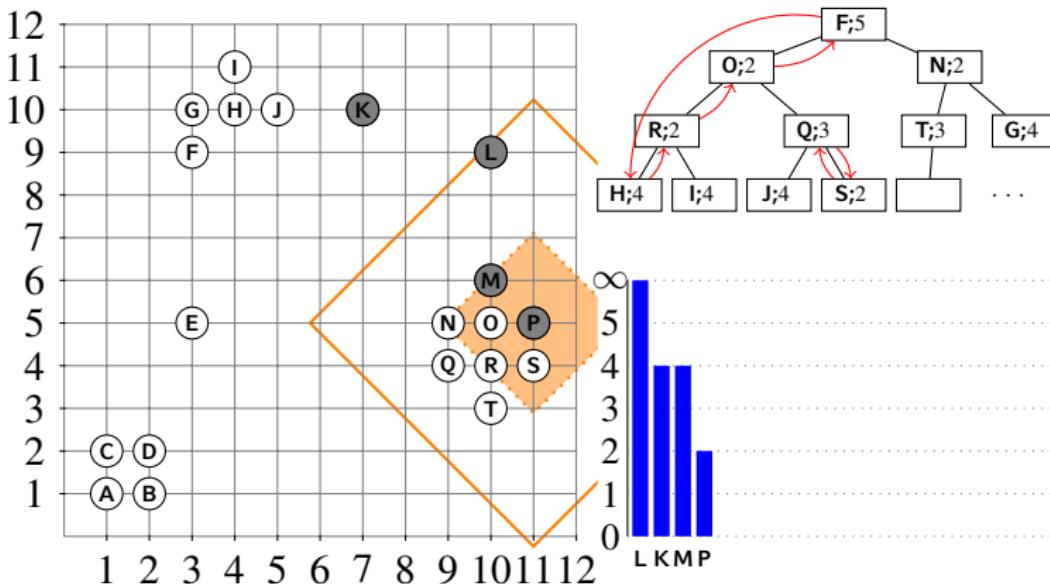
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

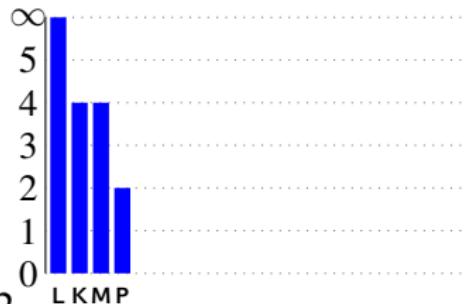
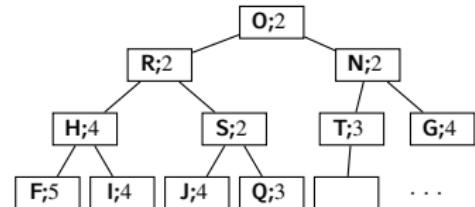
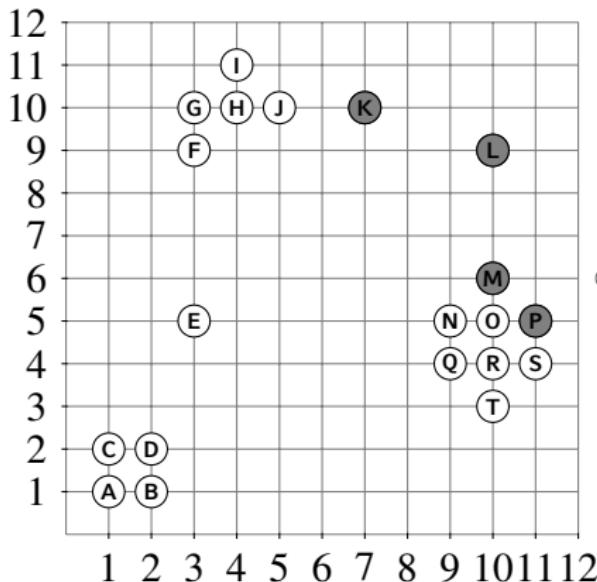
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

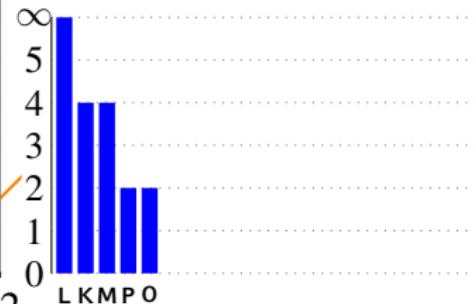
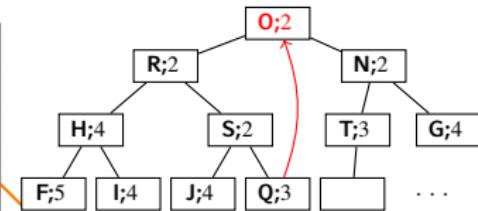
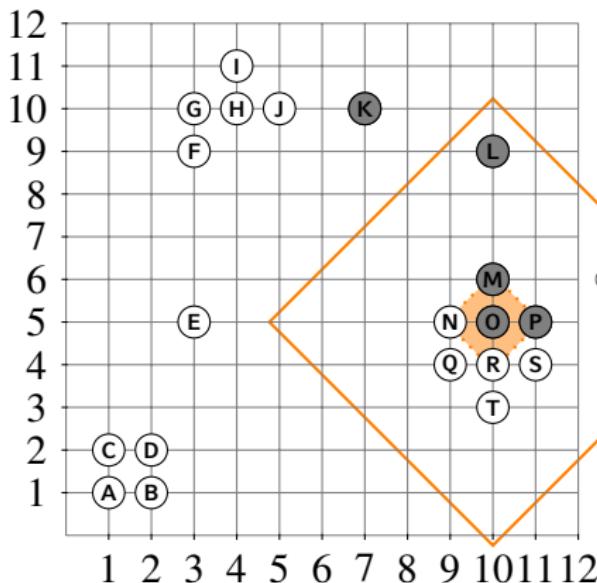
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

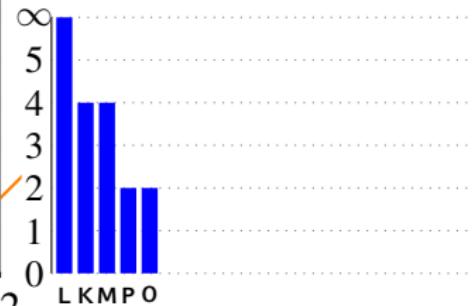
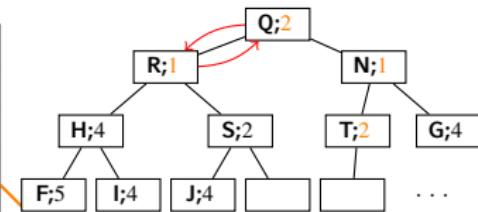
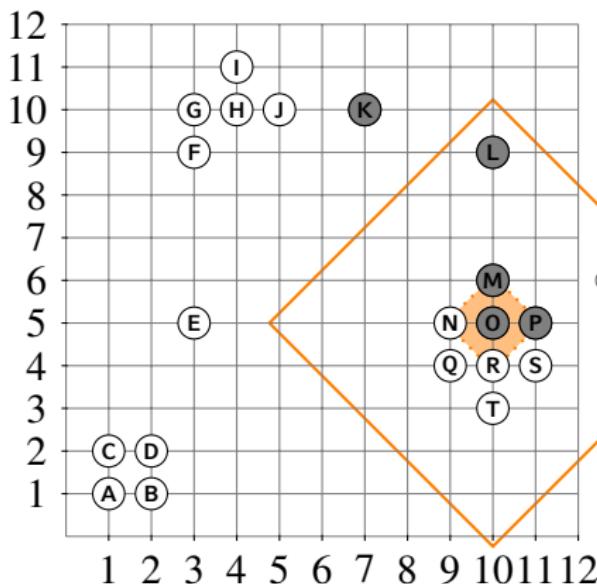
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

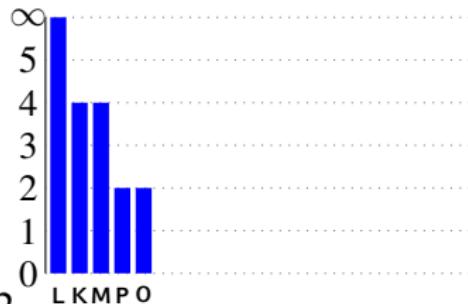
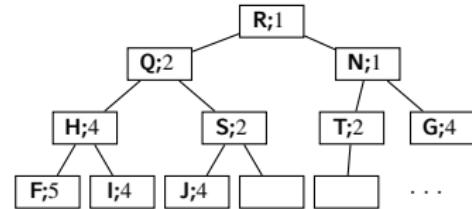
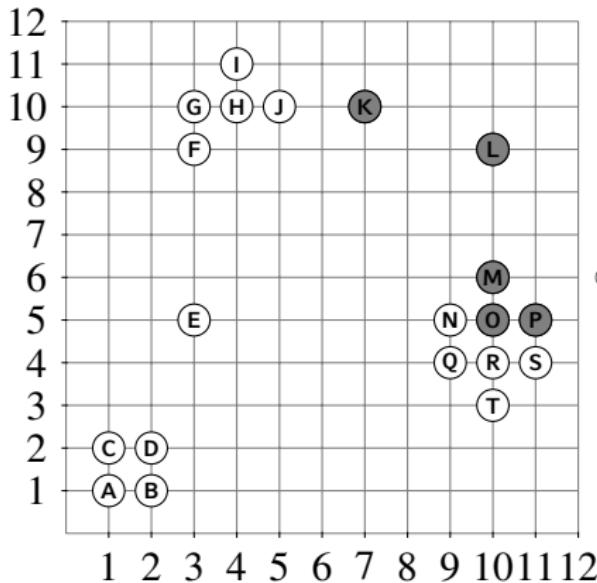
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

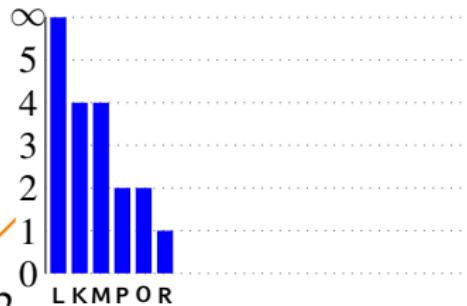
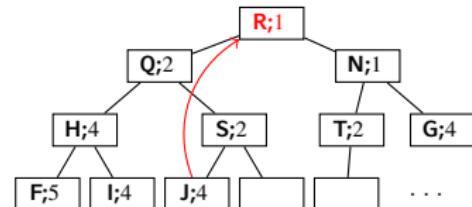
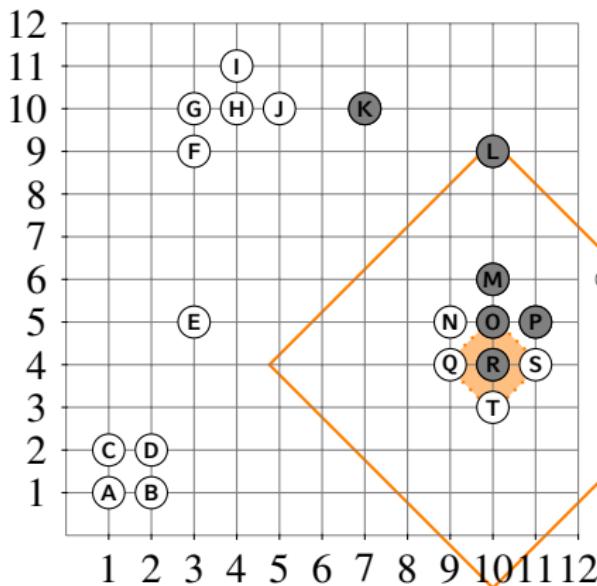
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

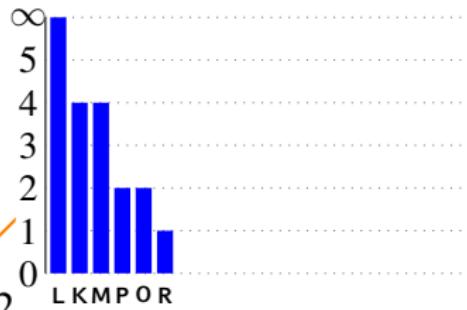
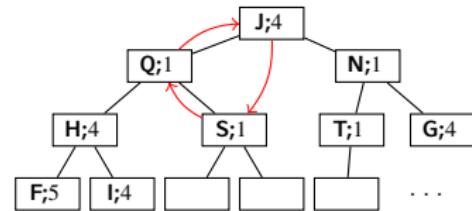
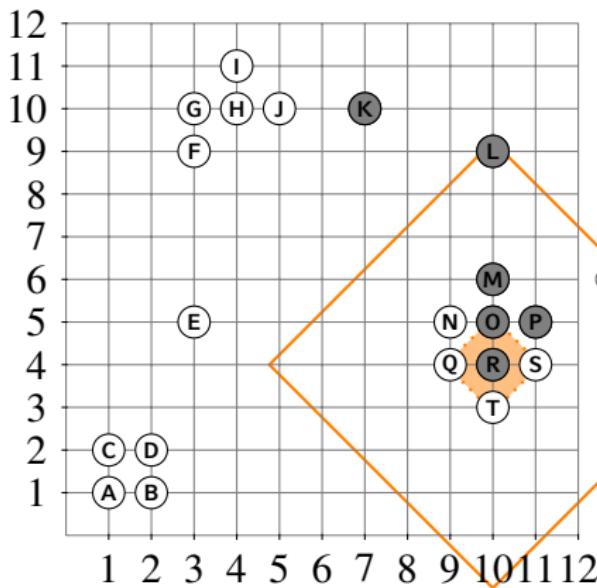
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

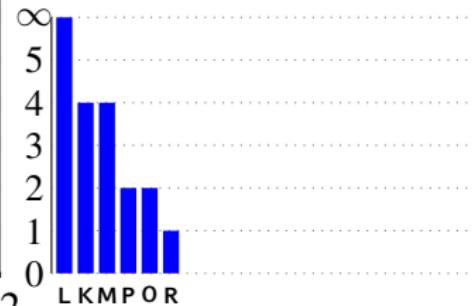
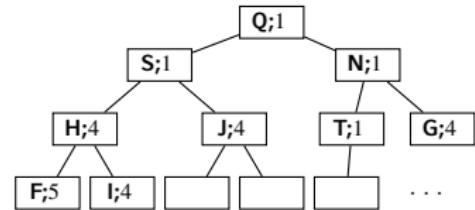
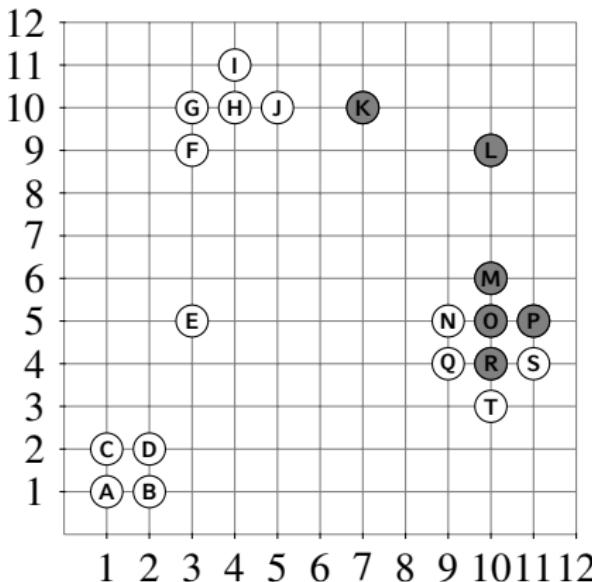
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

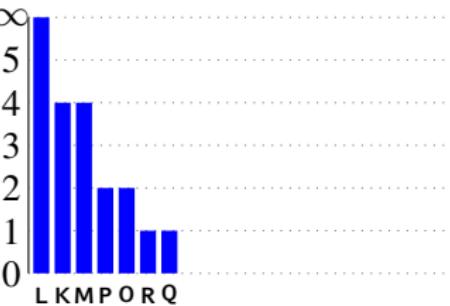
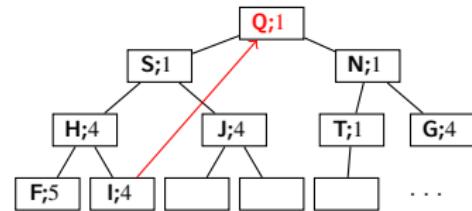
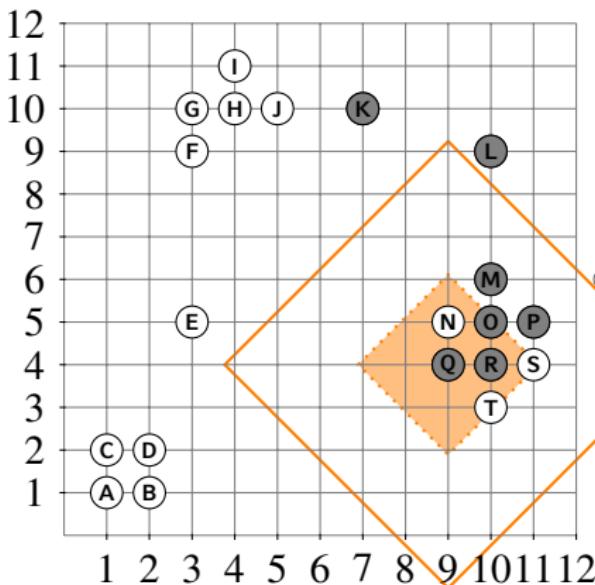
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

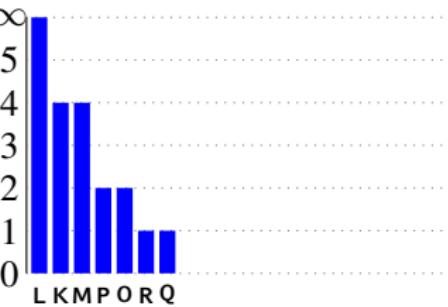
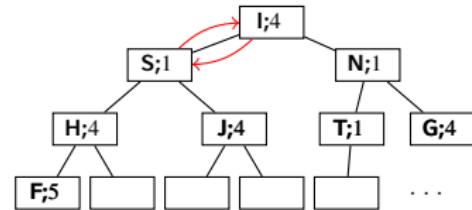
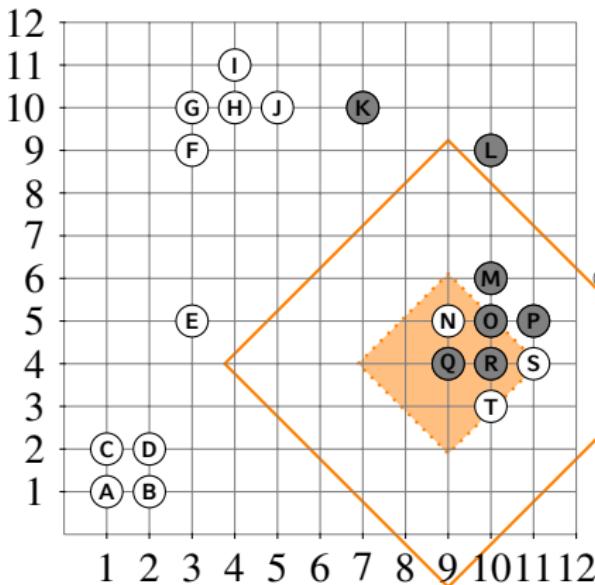
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

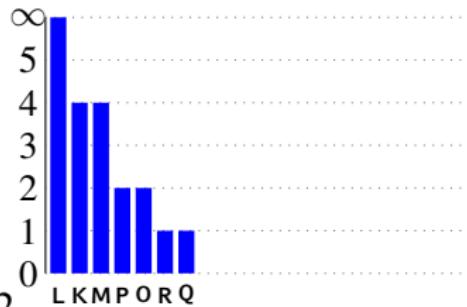
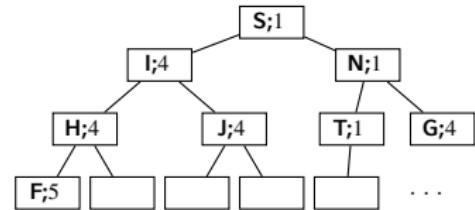
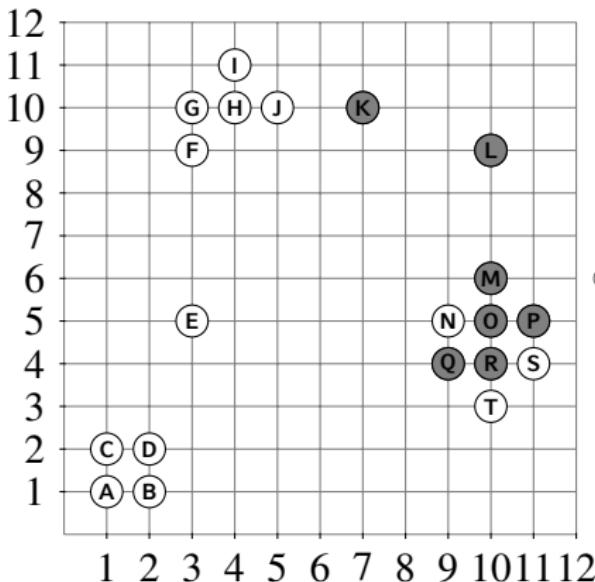
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

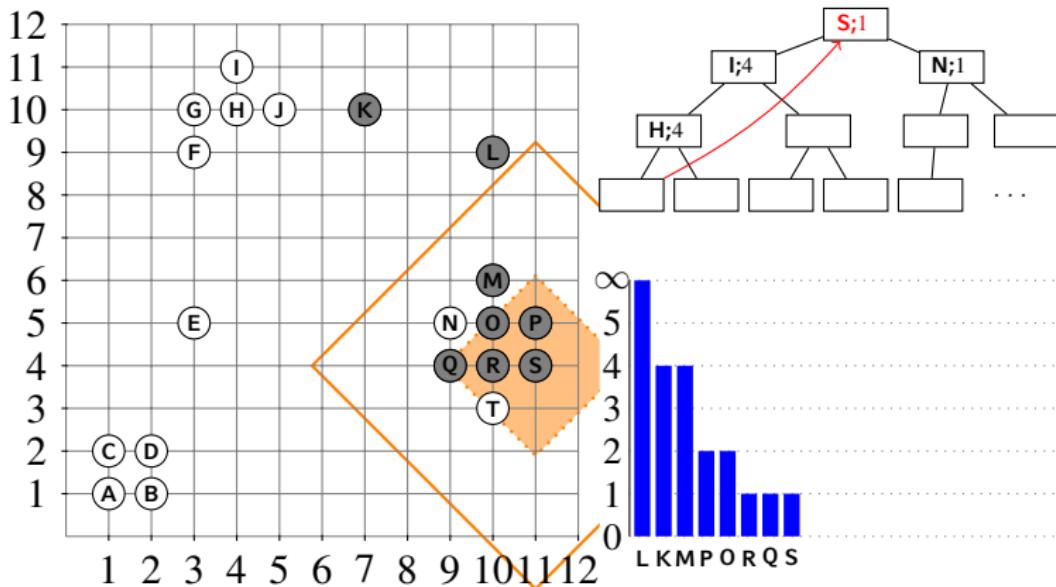
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
 $\text{minPts} = 2$ $\varepsilon = 5$,
 $\text{minPts} = 4$ $\varepsilon = 2$,
 $\text{minPts} = 4$

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

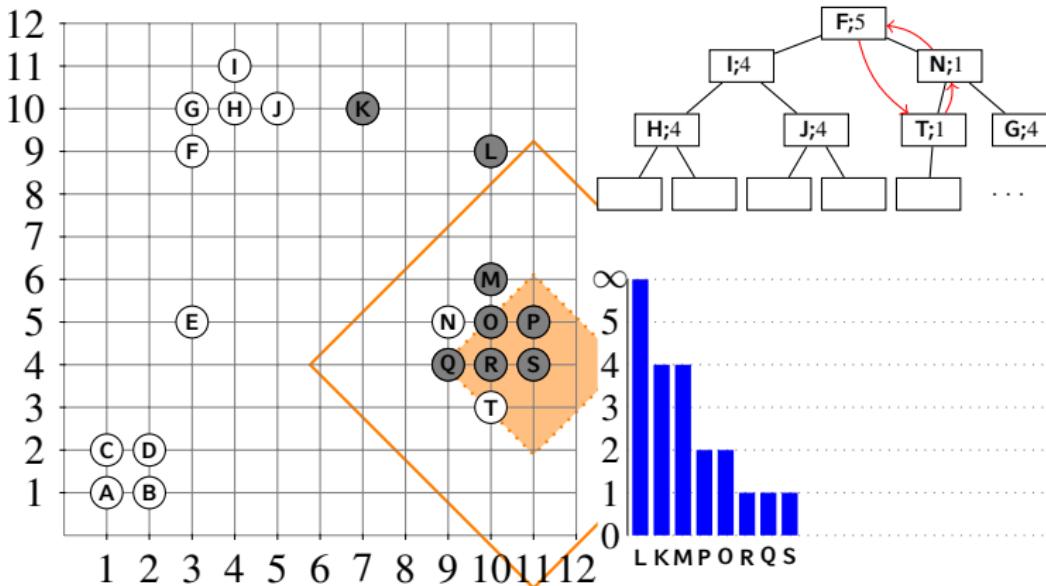
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

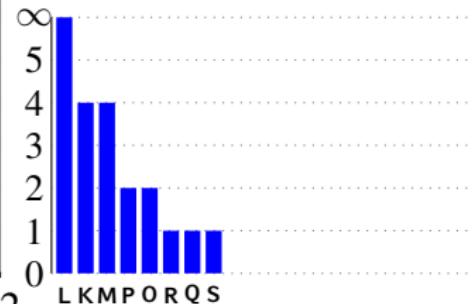
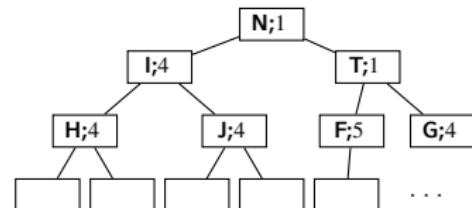
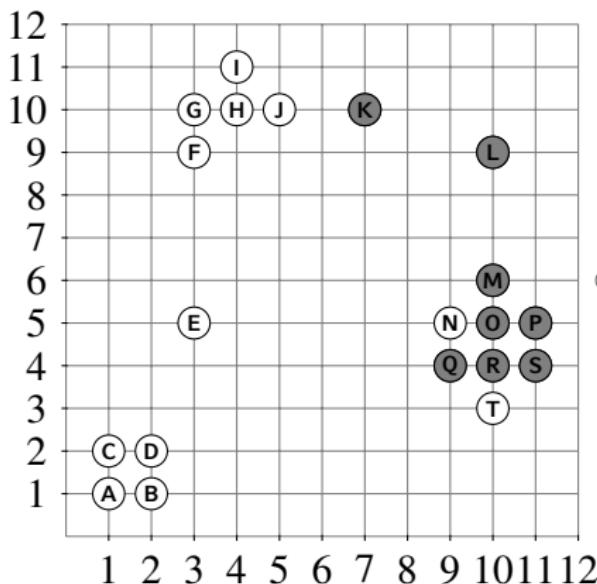
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

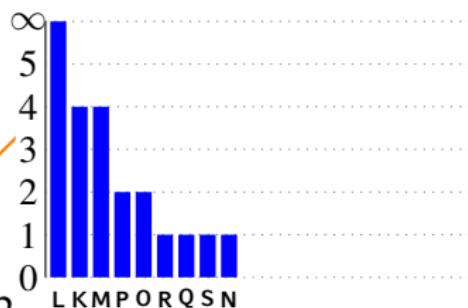
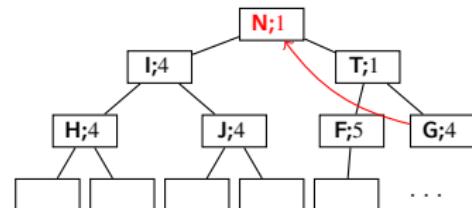
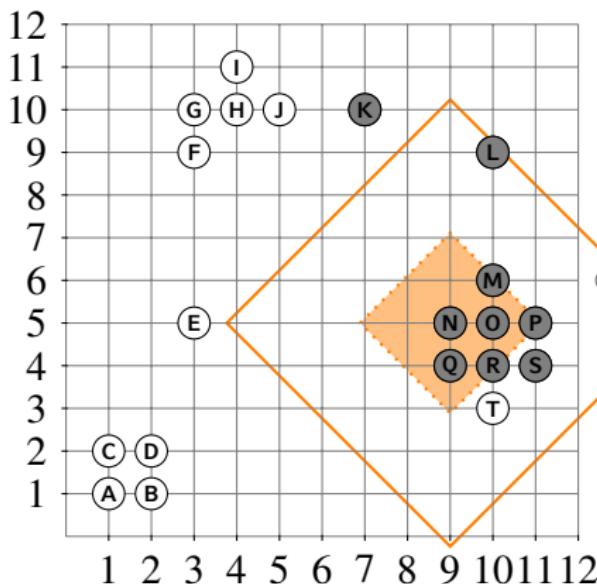
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

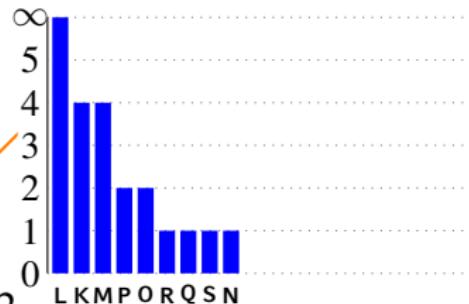
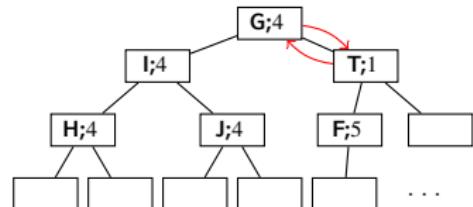
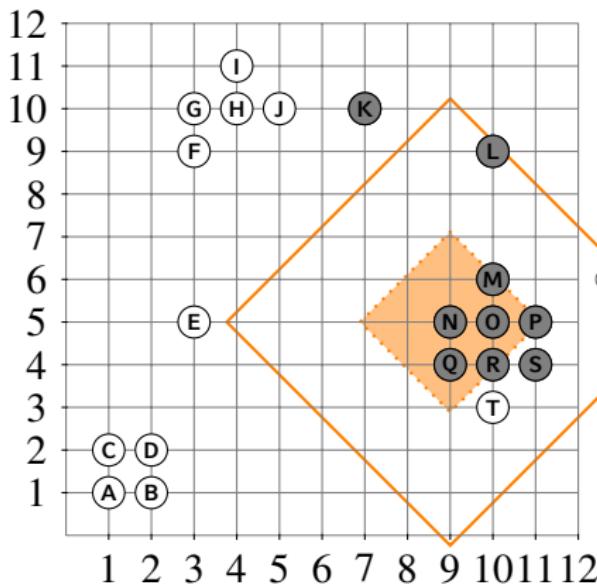
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

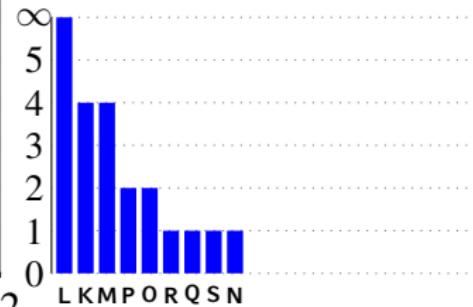
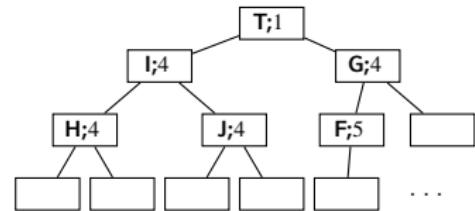
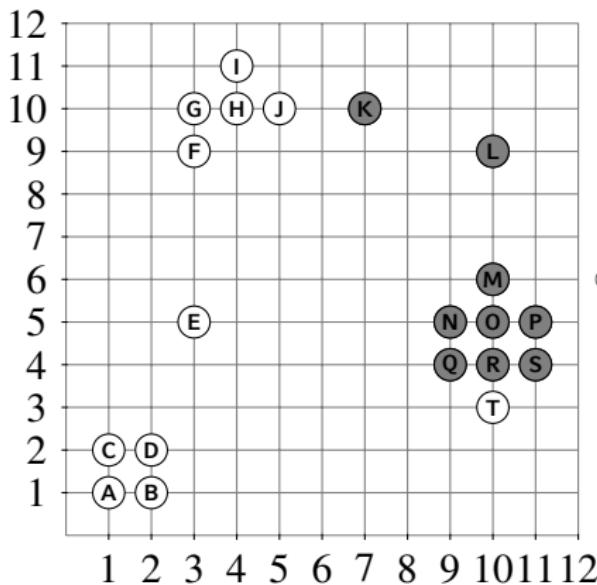
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

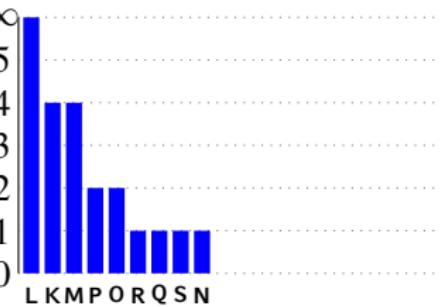
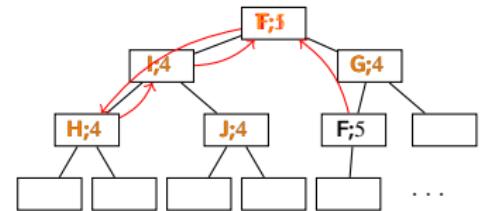
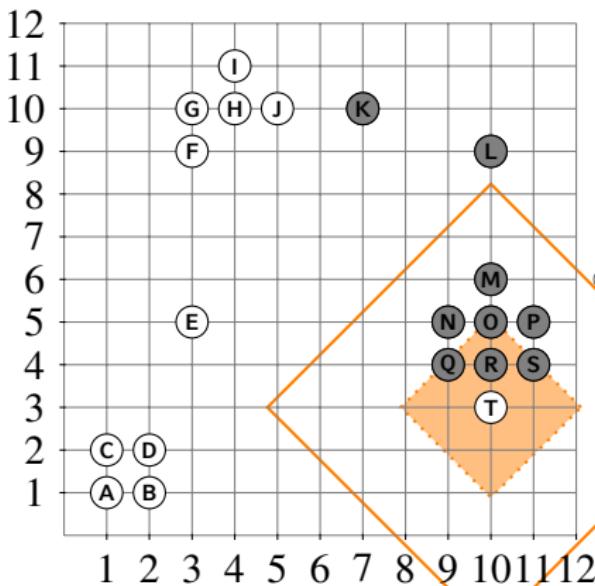
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

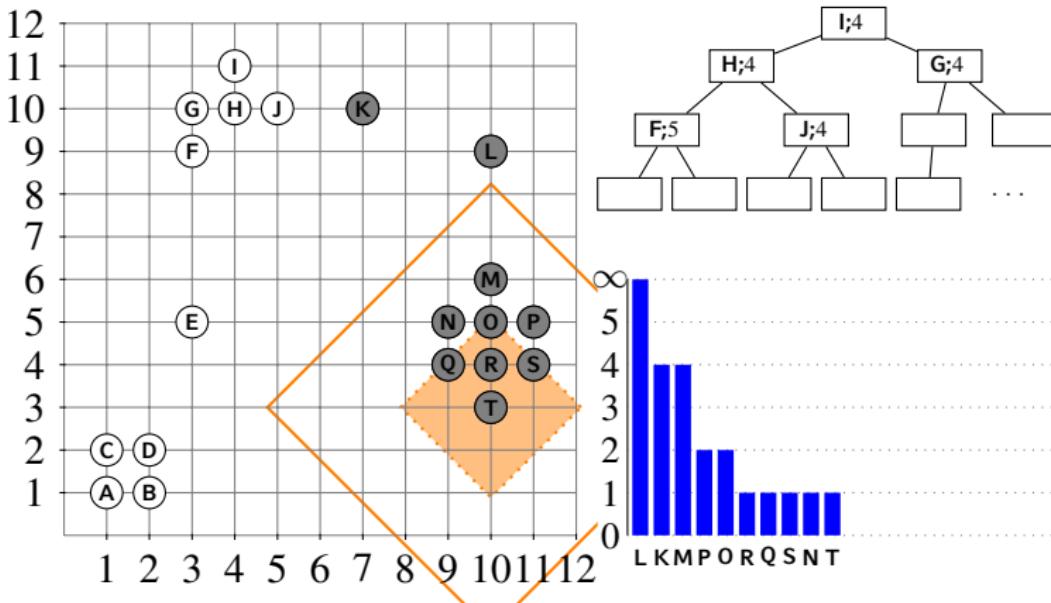
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

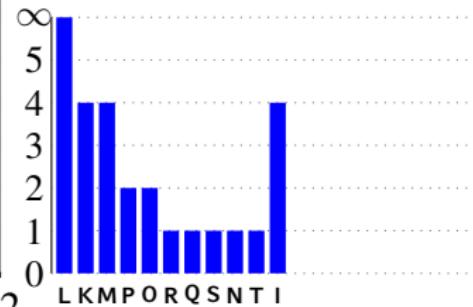
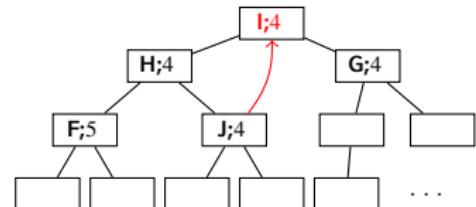
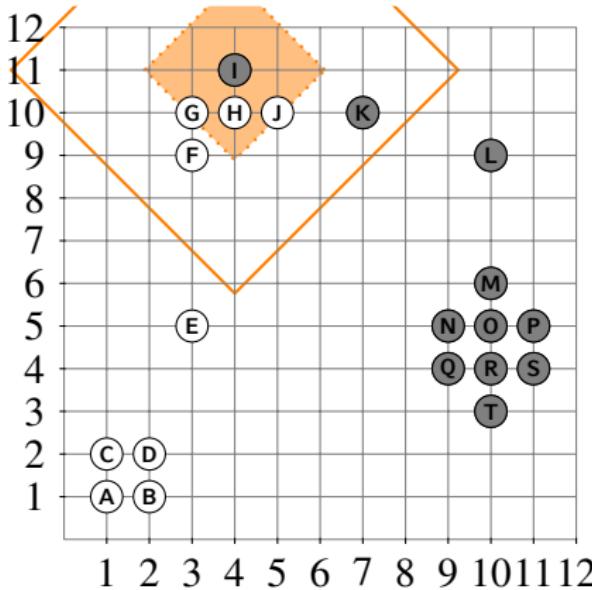
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

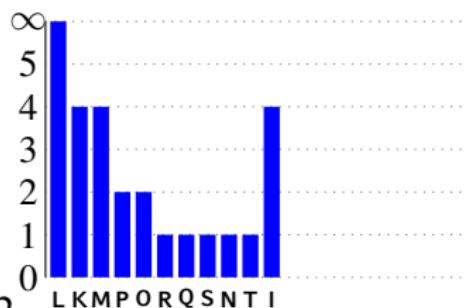
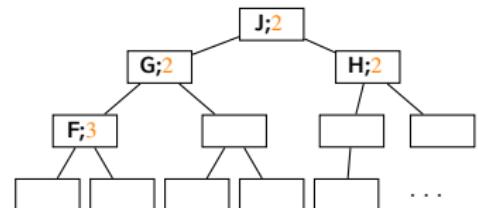
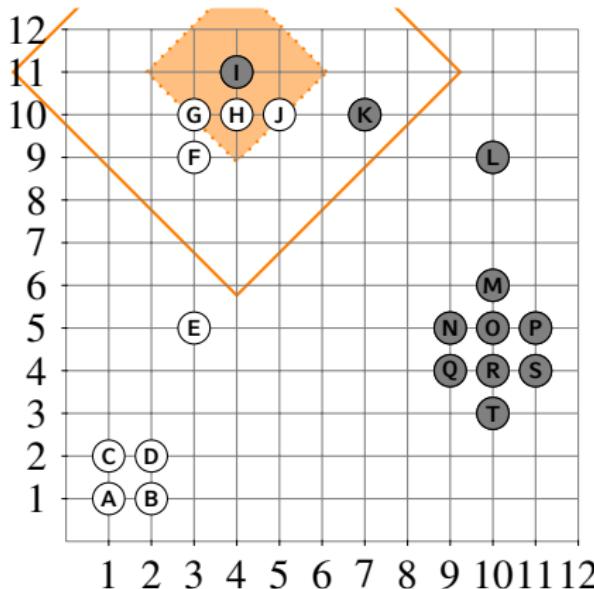
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

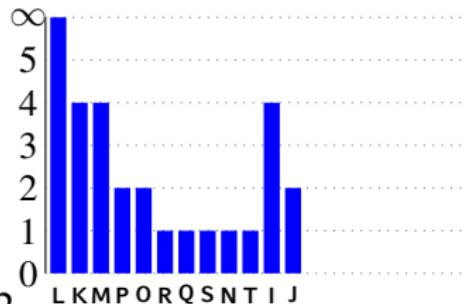
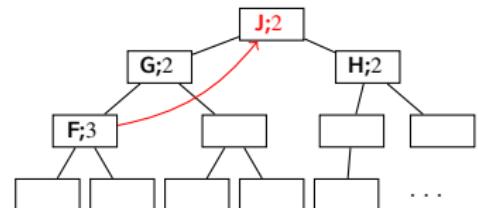
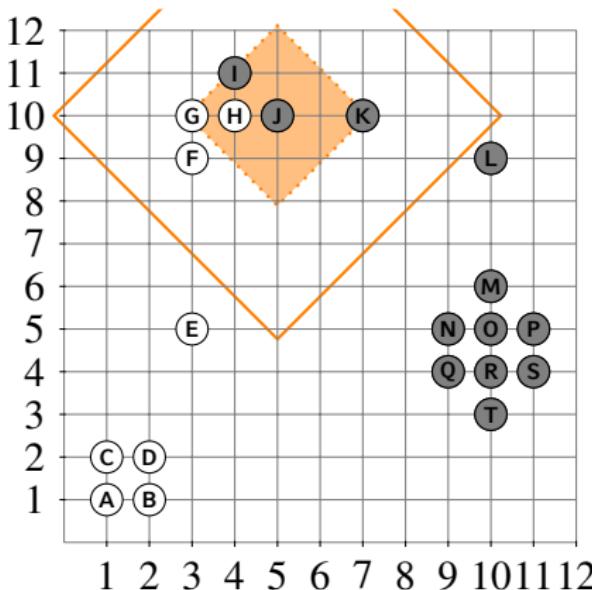
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

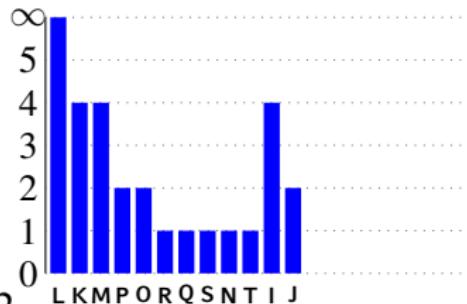
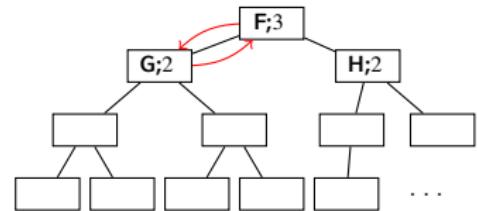
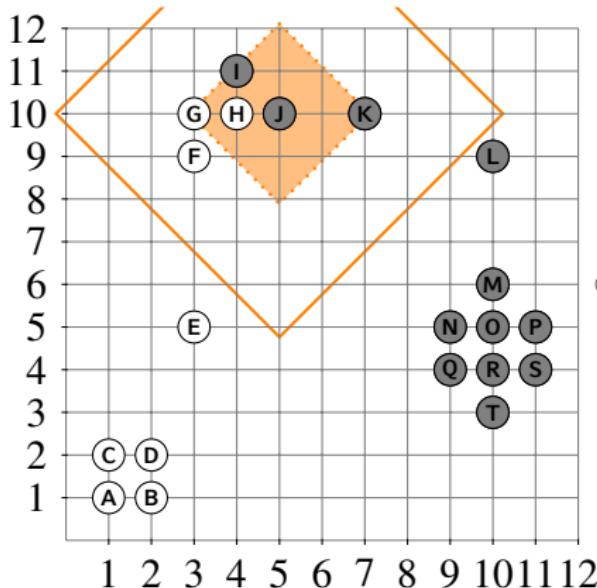
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

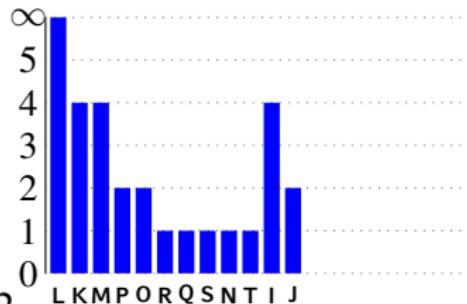
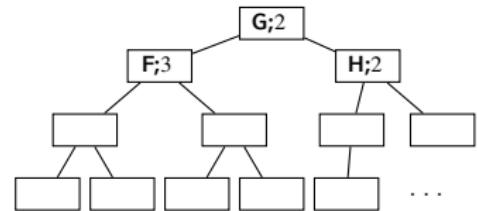
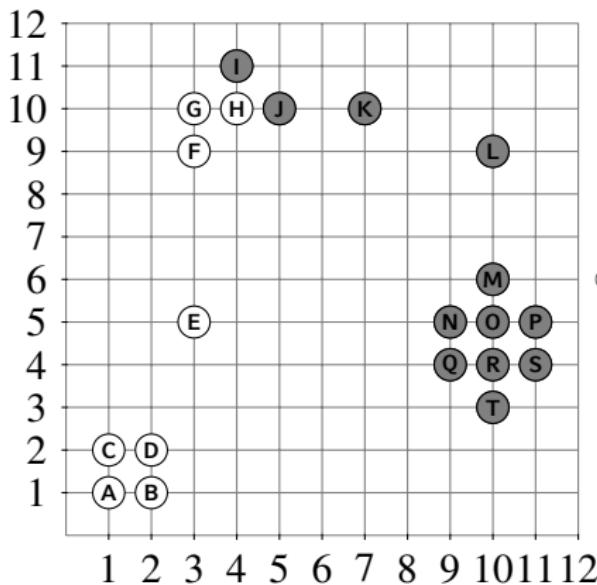
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

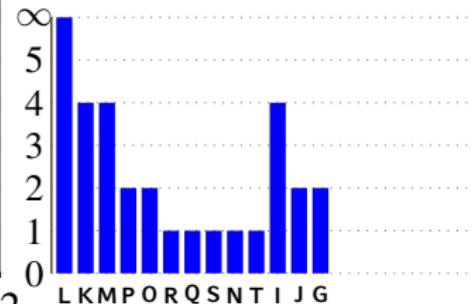
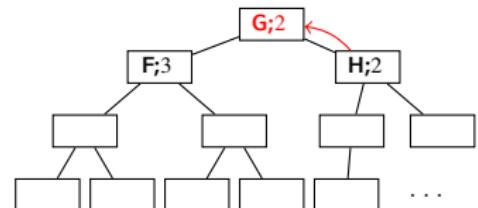
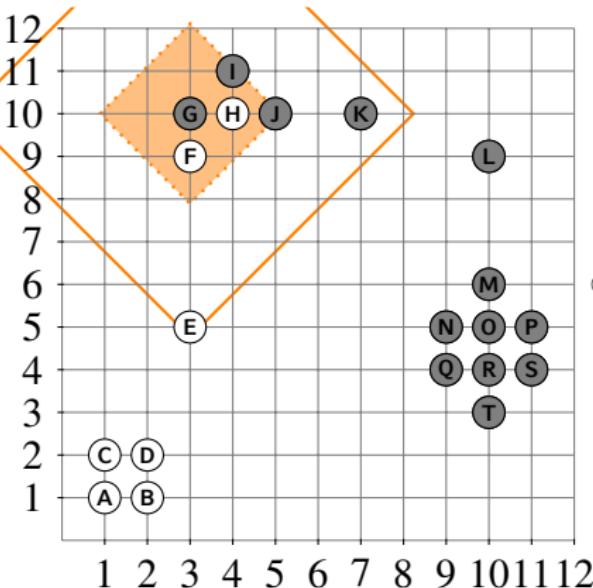
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

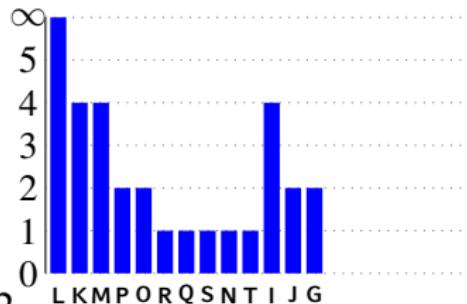
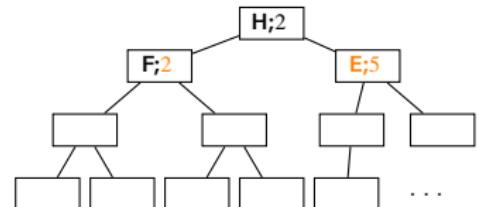
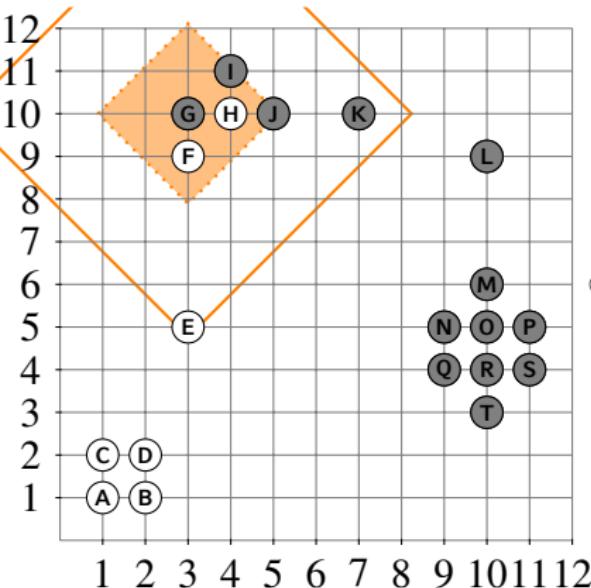
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

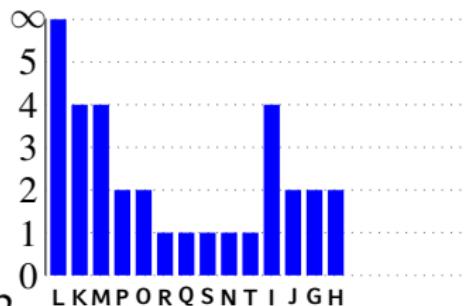
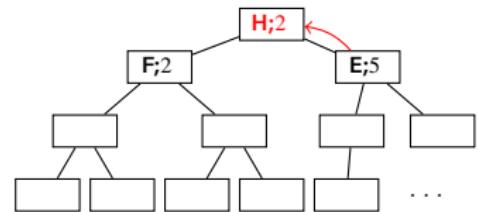
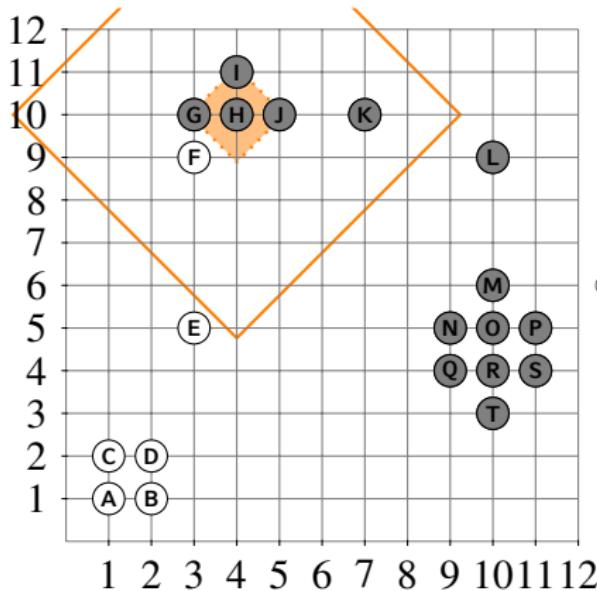
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
 $\text{minPts} = 2$ $\varepsilon = 5$,
 $\text{minPts} = 4$ $\varepsilon = 2$,
 $\text{minPts} = 4$

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

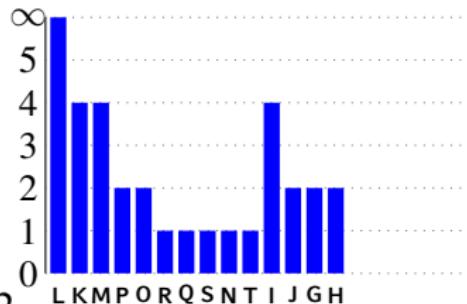
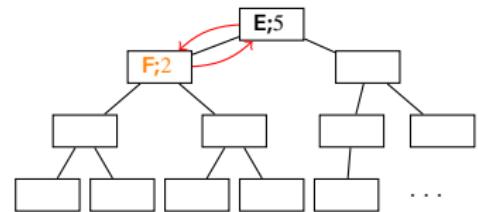
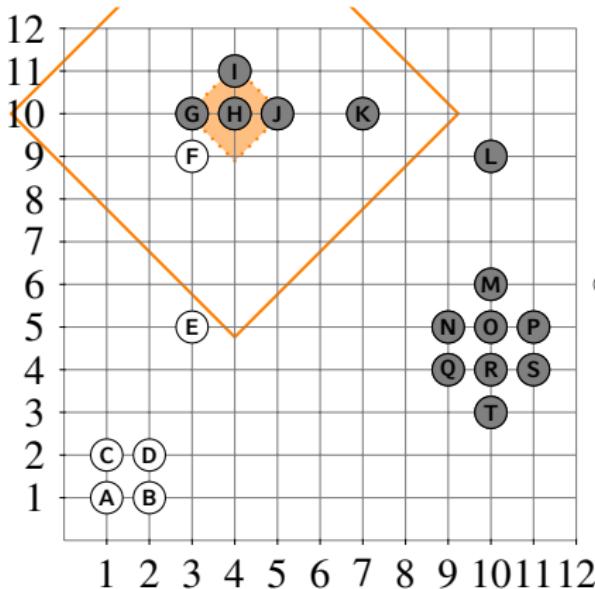
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

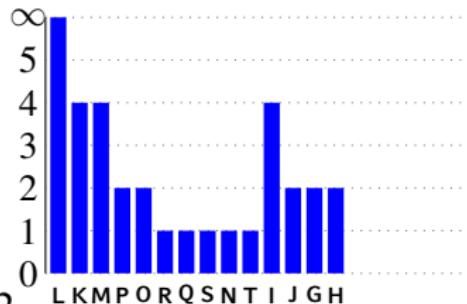
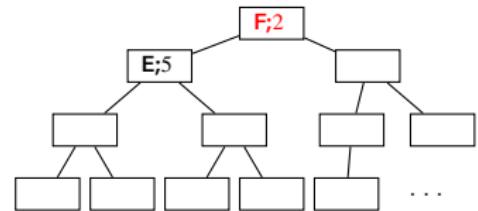
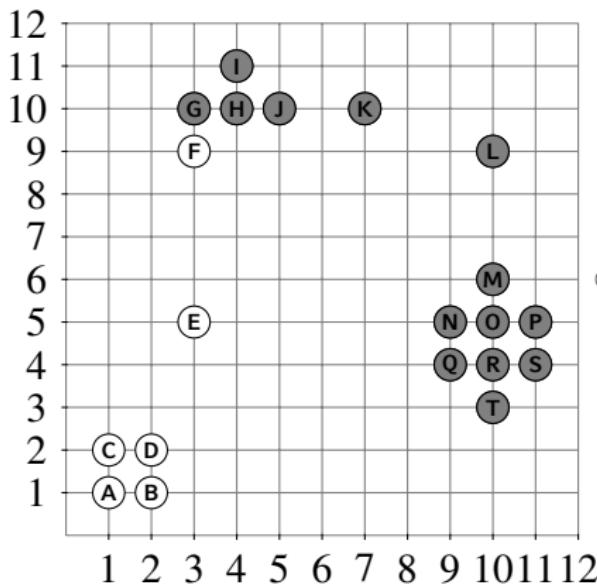
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

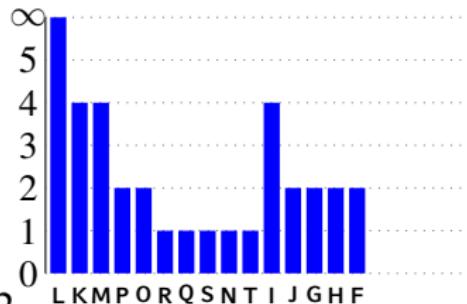
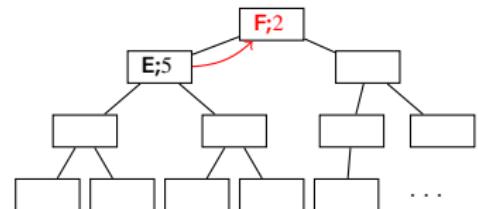
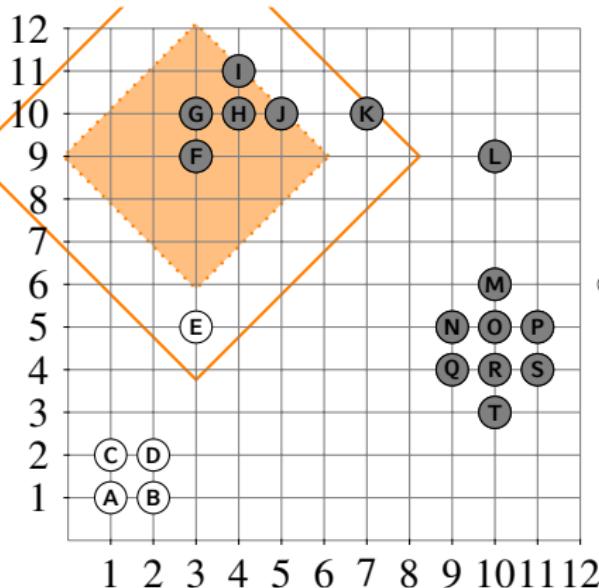
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
 $\text{minPts} = 2$ $\varepsilon = 5$,
 $\text{minPts} = 4$ $\varepsilon = 2$,
 $\text{minPts} = 4$

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

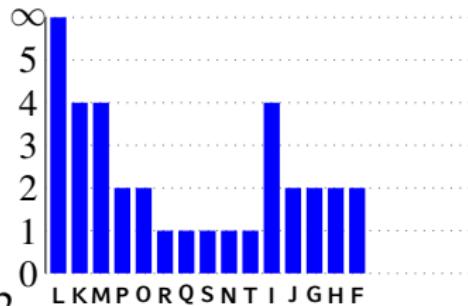
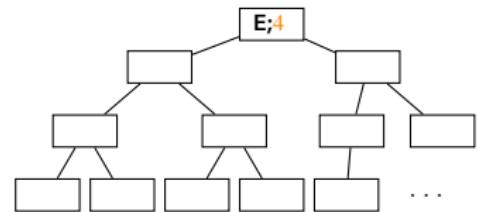
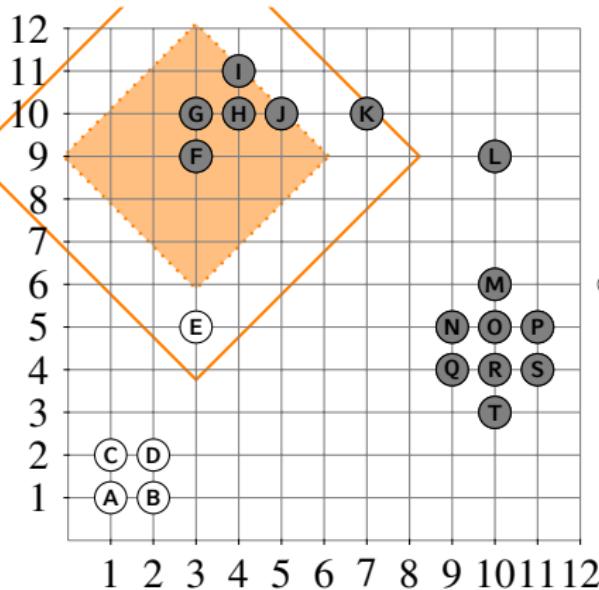
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
 $\text{minPts} = 2$ $\varepsilon = 5$,
 $\text{minPts} = 4$ $\varepsilon = 2$,
 $\text{minPts} = 4$

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

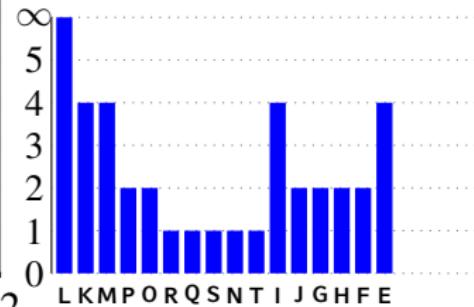
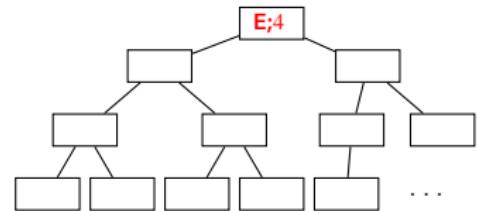
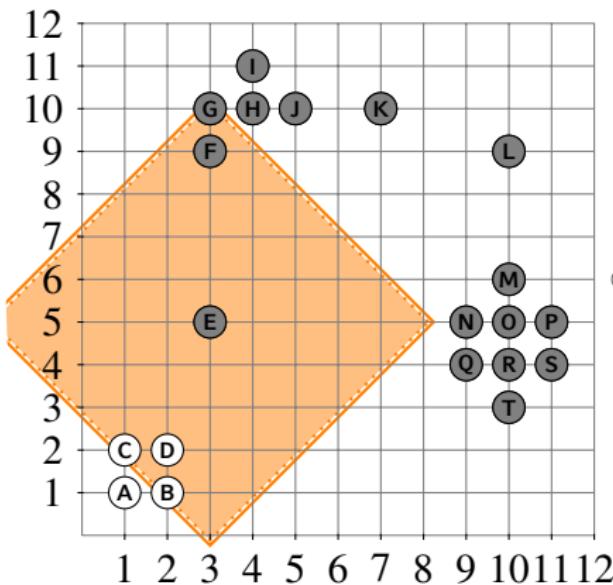
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

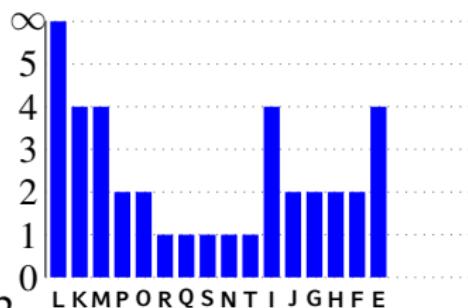
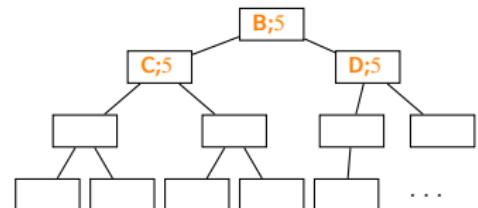
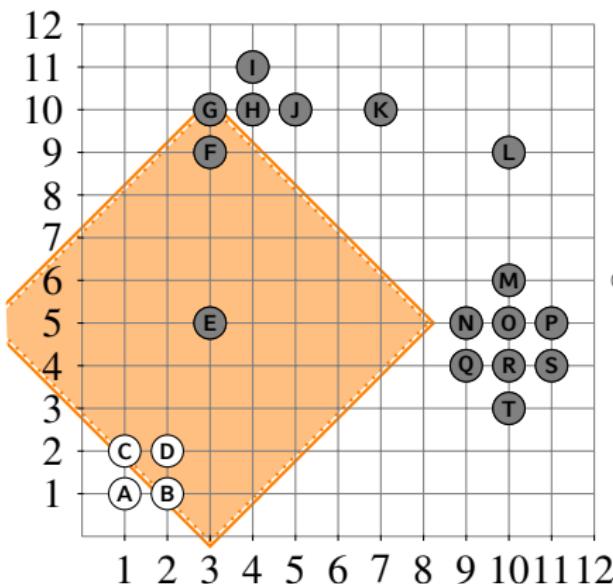
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

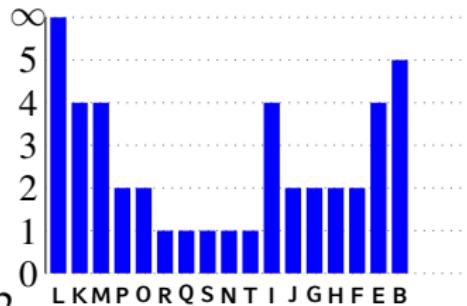
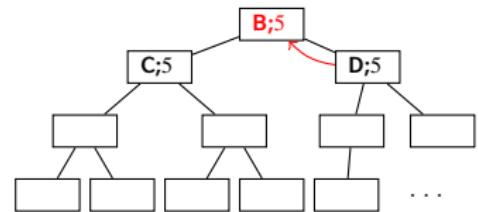
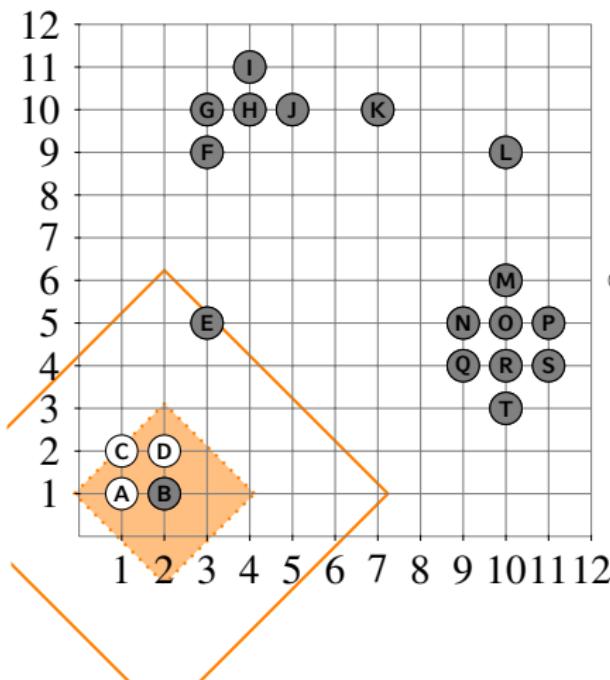
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

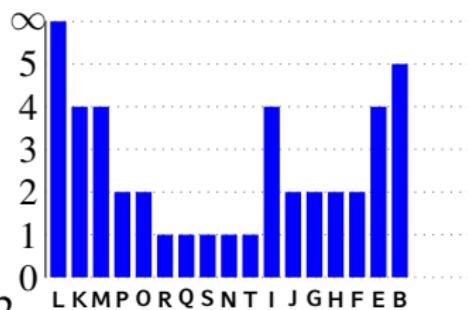
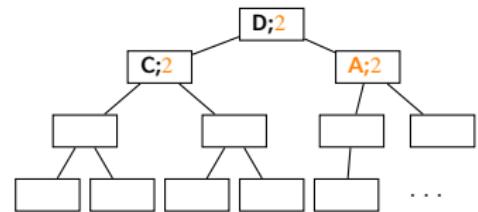
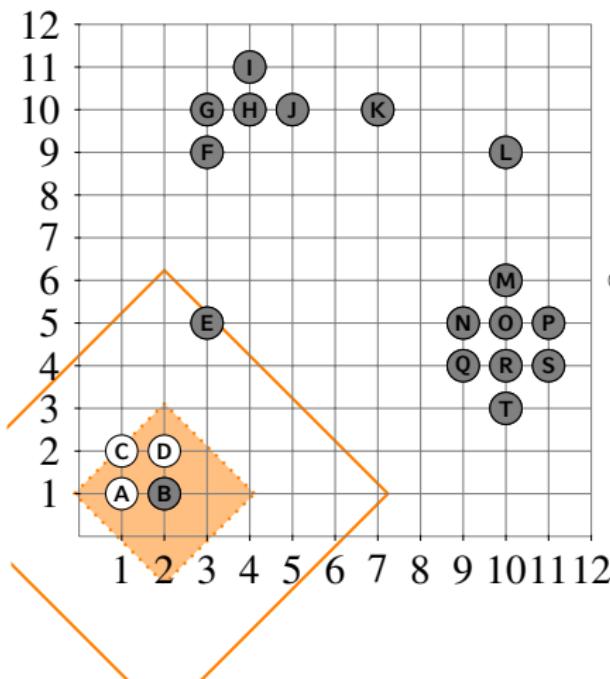
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

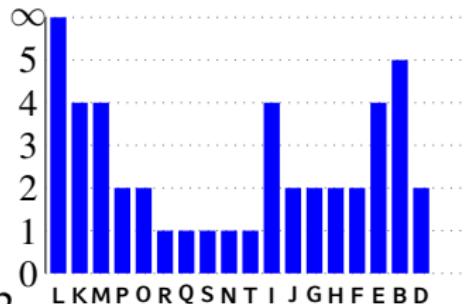
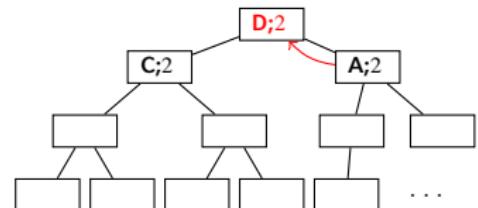
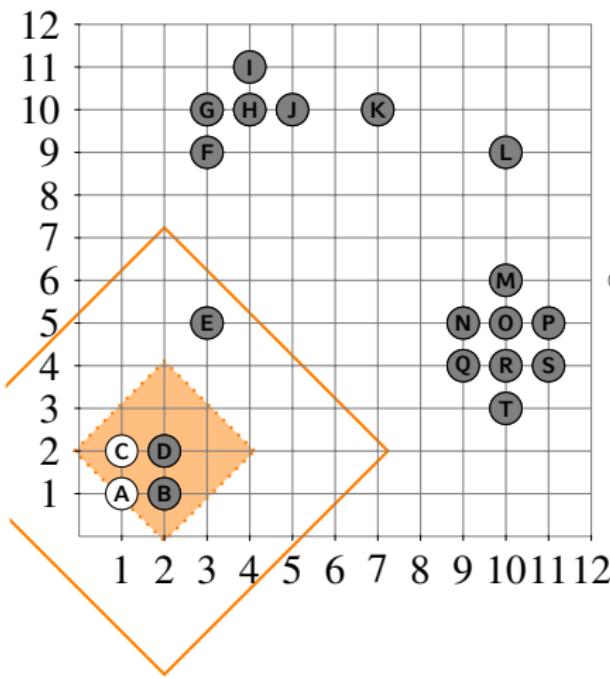
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
 $\text{minPts} = 2$ $\varepsilon = 5$,
 $\text{minPts} = 4$ $\varepsilon = 2$,
 $\text{minPts} = 4$

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

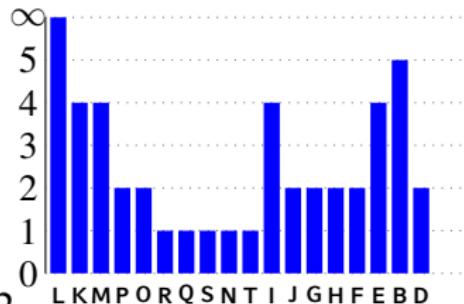
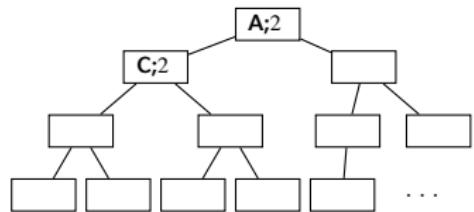
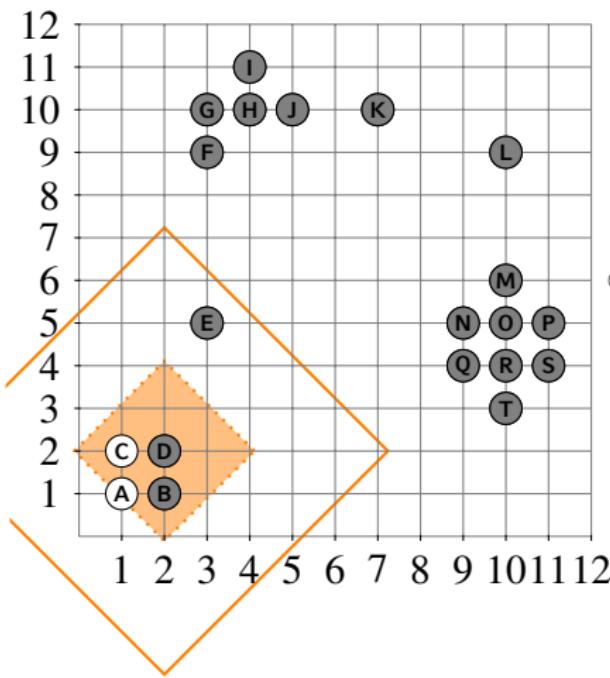
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
 $\text{minPts} = 2$ $\varepsilon = 5$,
 $\text{minPts} = 4$ $\varepsilon = 2$,
 $\text{minPts} = 4$

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

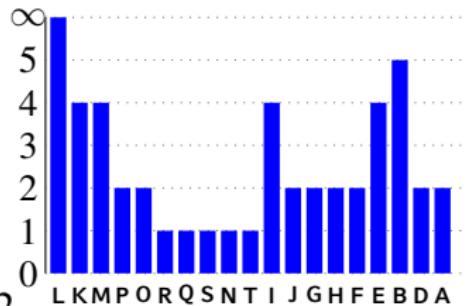
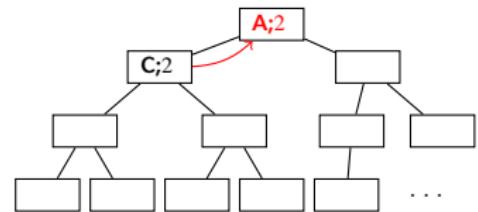
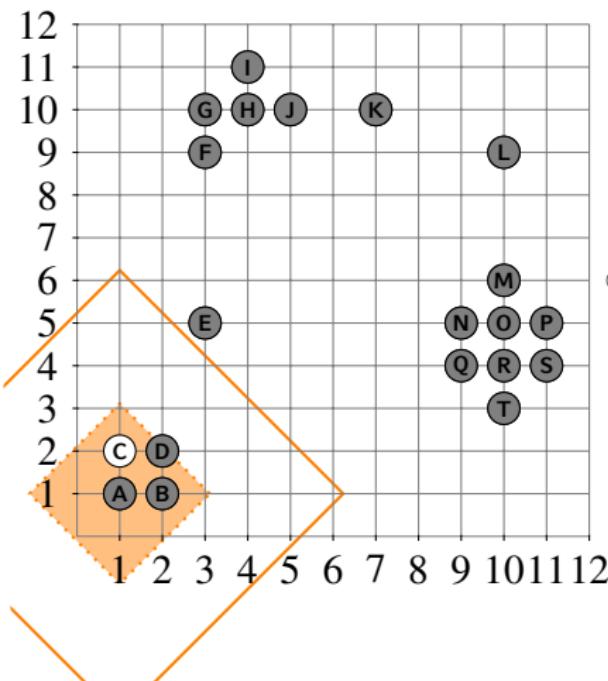
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

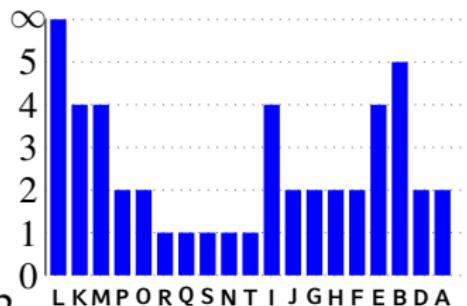
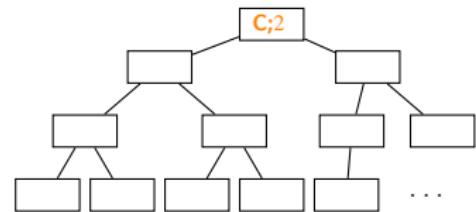
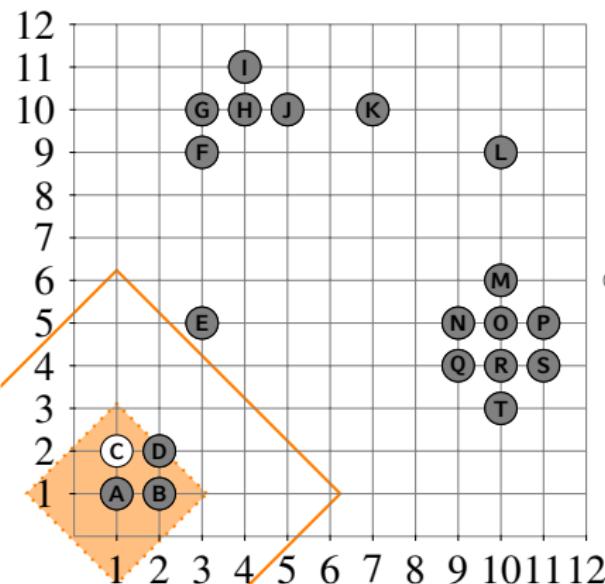
Aufgabe 4-3

$\varepsilon = 5$,
minPts= 2

$\varepsilon = 5$,
minPts = 4

$\varepsilon = 2$,
minPts= 4

Vergleich



Data Mining Tutorial

E. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

Aufgabe 4-2

DBSCAN und
Single-Link

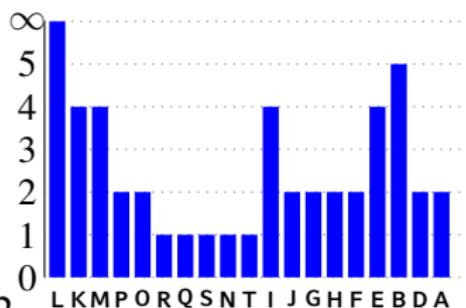
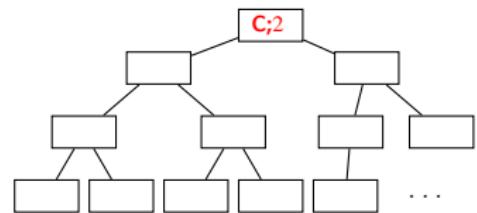
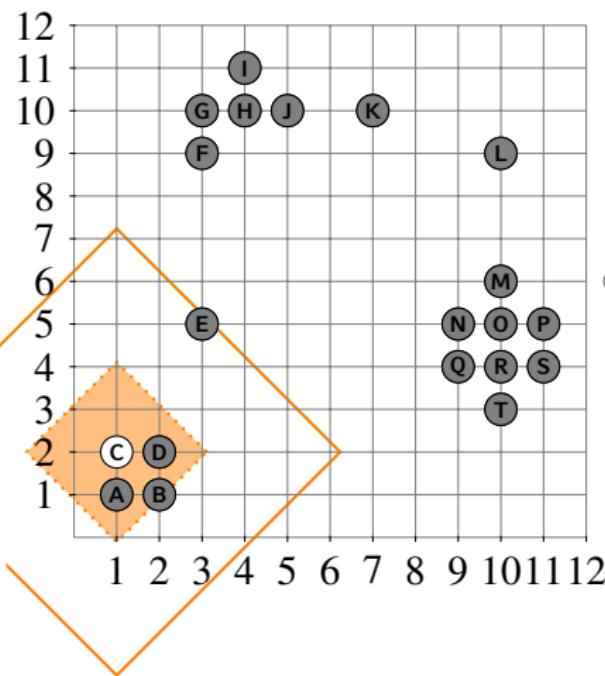
Aufgabe 4-3

$\varepsilon = 5$,
minPts= 2

$\varepsilon = 5$,
minPts= 4

$\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

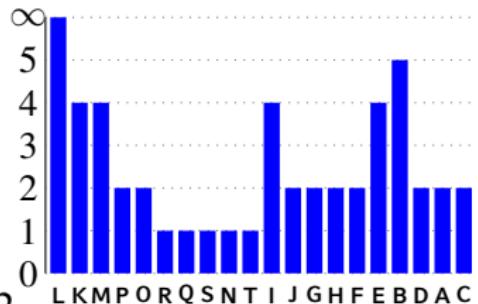
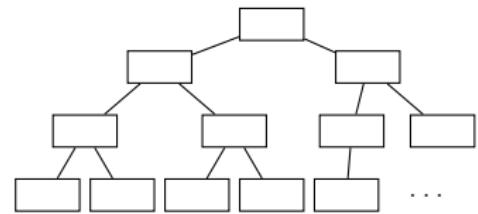
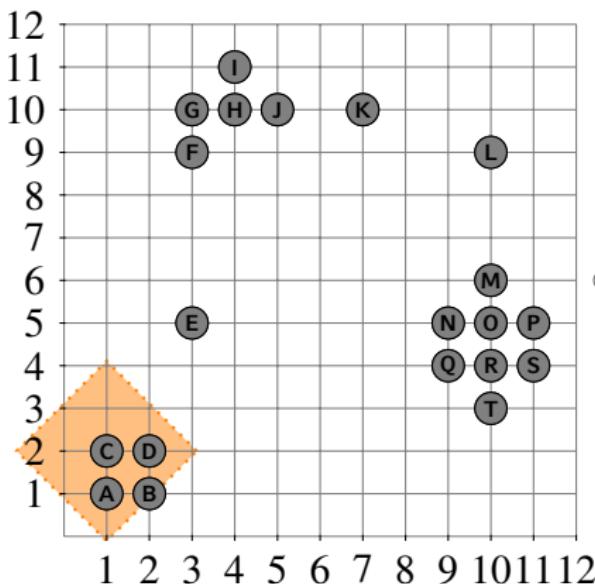
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
 $\text{minPts} = 2$ $\varepsilon = 5$,
 $\text{minPts} = 4$ $\varepsilon = 2$,
 $\text{minPts} = 4$

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

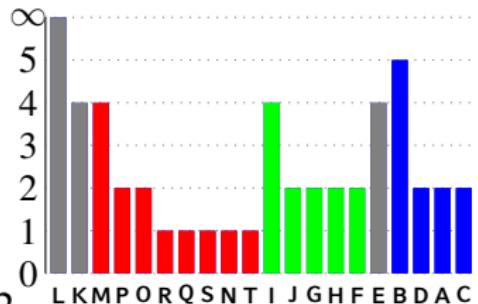
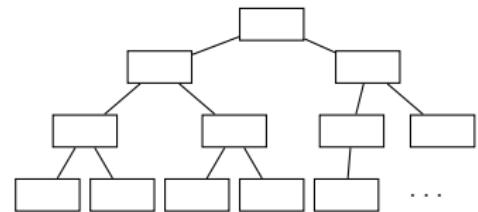
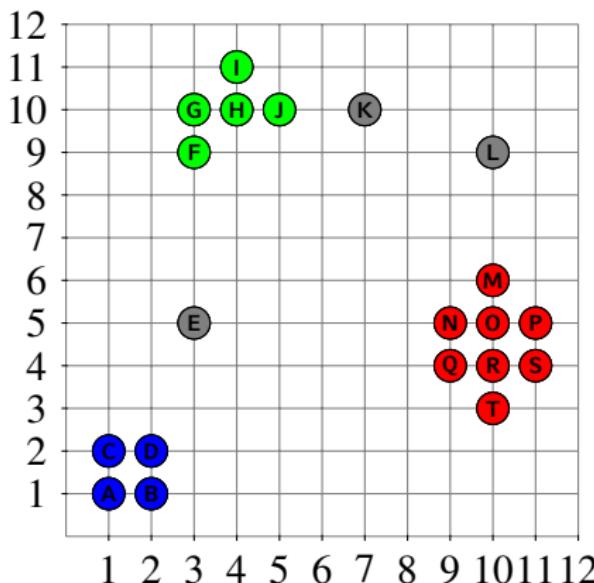
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich

(Intuitive Cluster \approx Täler)

Anfang ("Eingang") gehört i.d.R. dazu, Ende nicht!

Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

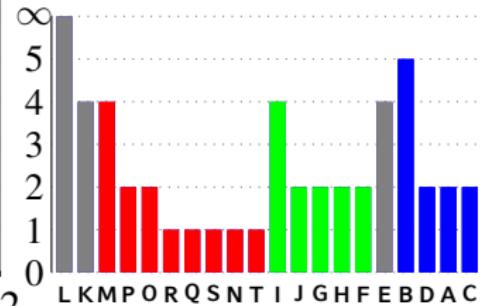
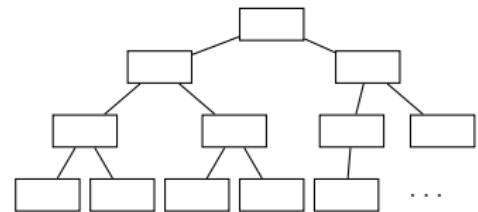
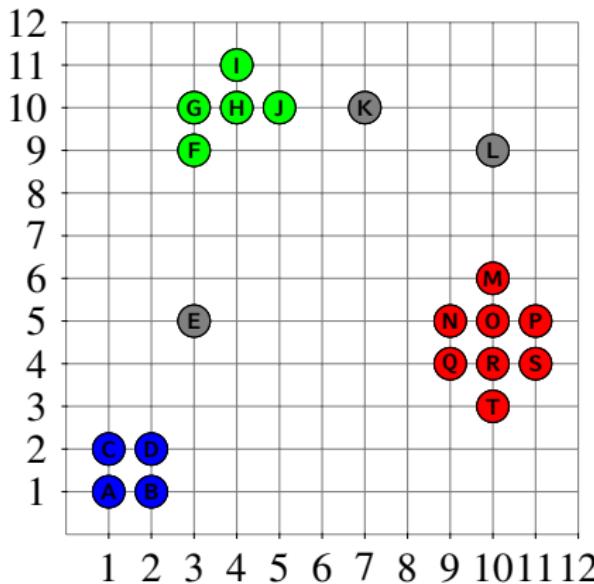
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Plot ist stärker geglättet!

Heap zufälligerweise etwas teurer (nicht zwangsläufig!)

Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

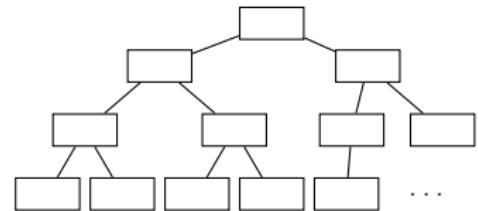
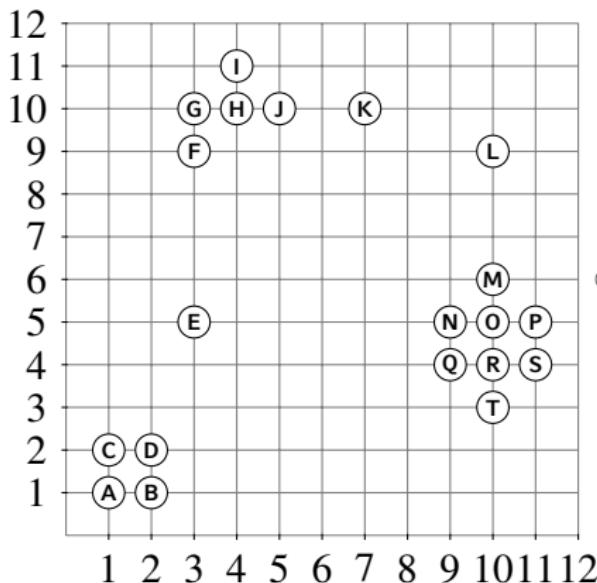
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

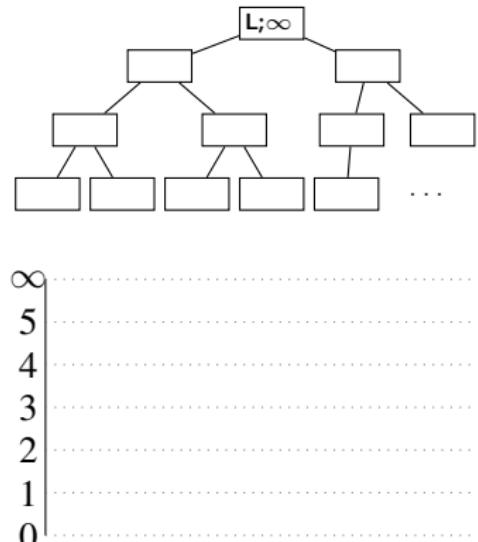
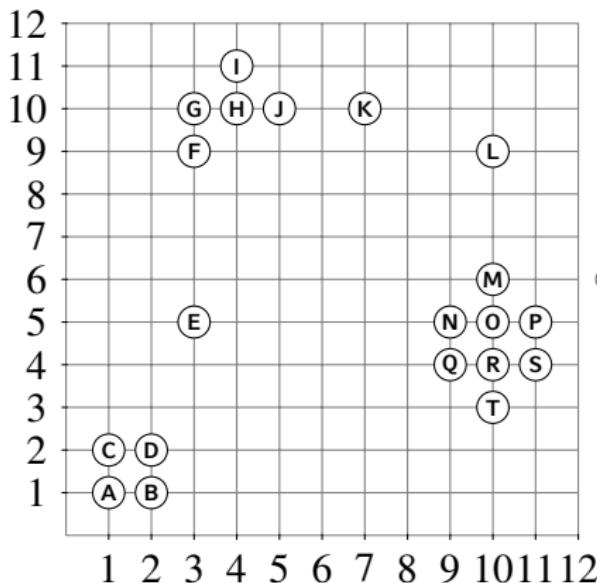
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

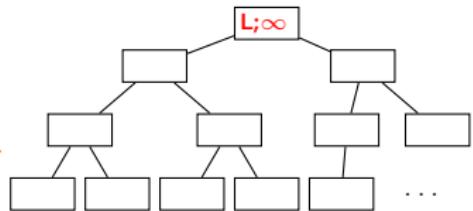
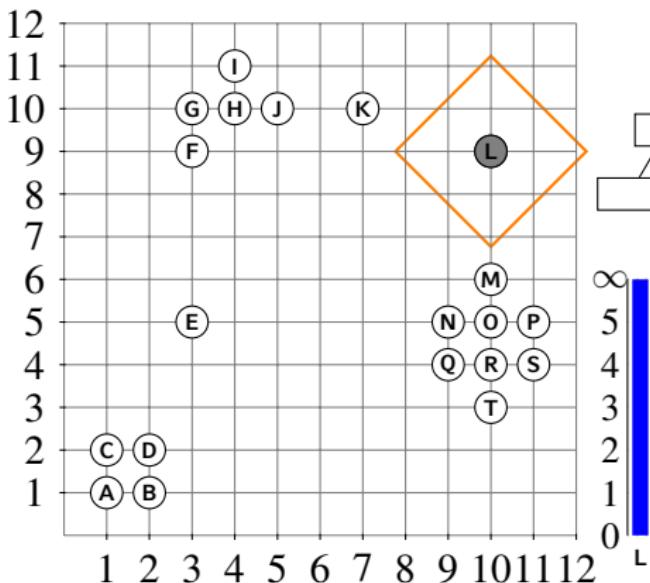
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

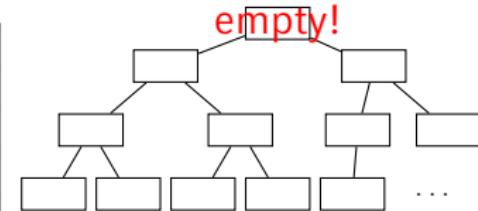
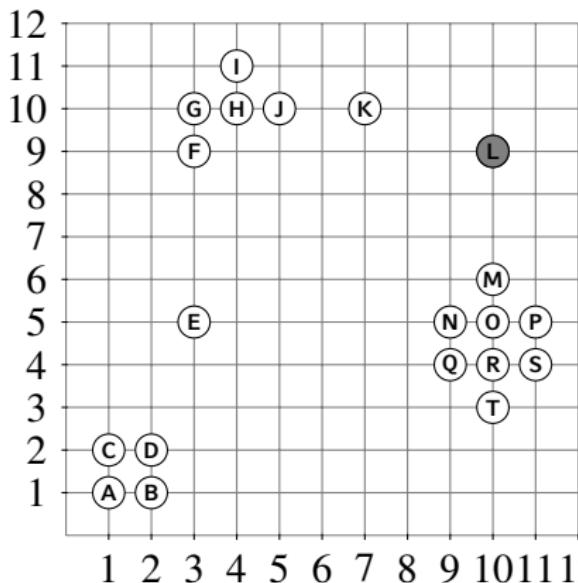
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

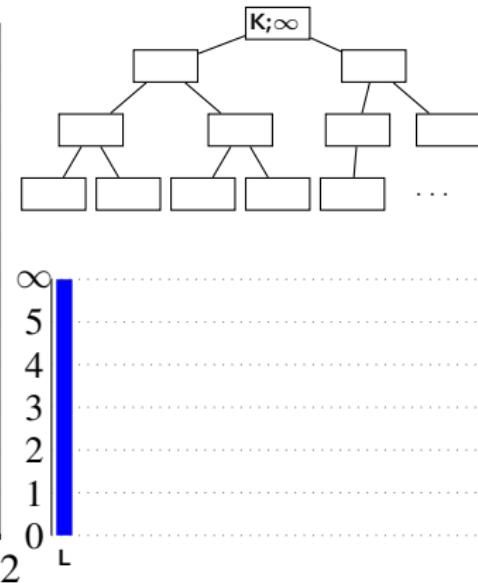
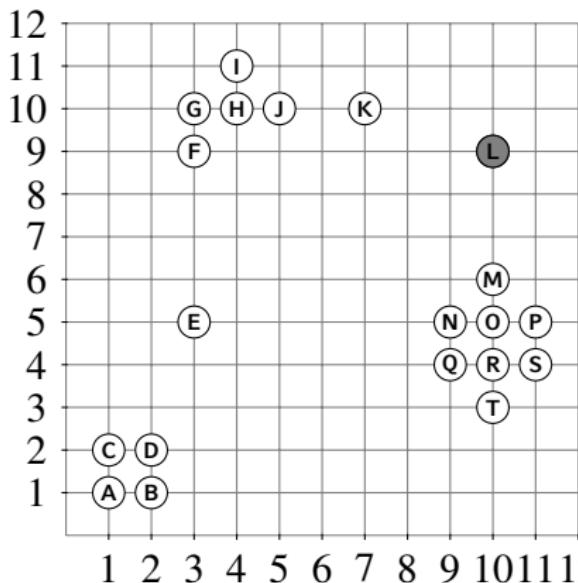
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

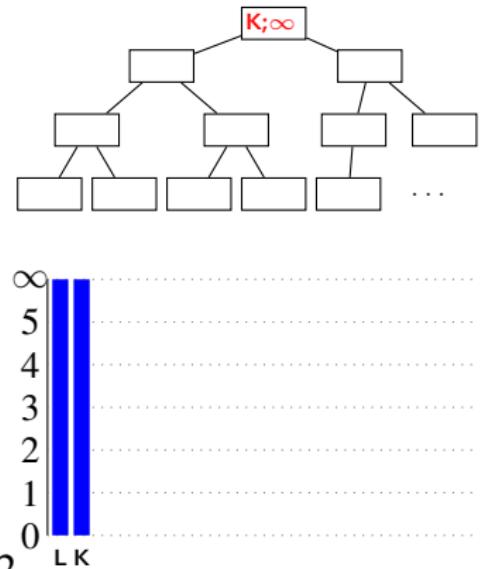
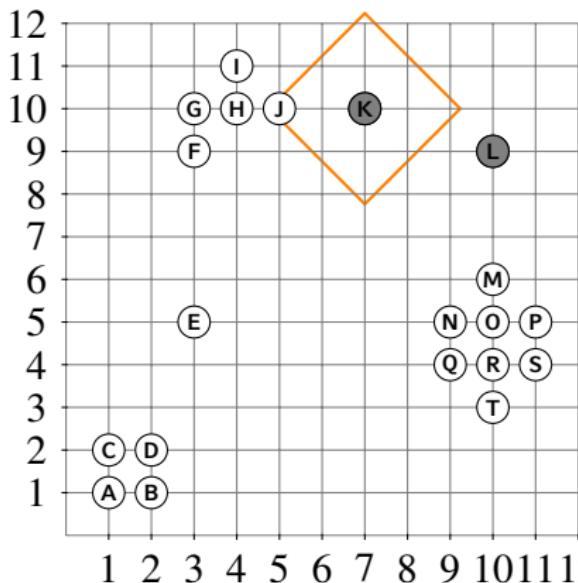
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

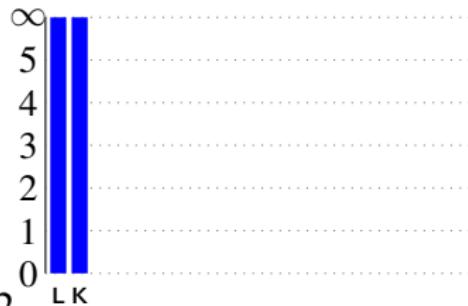
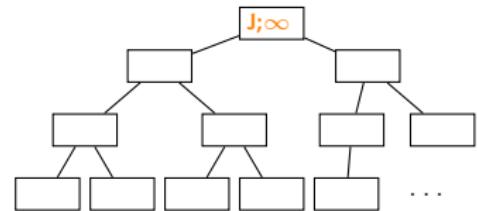
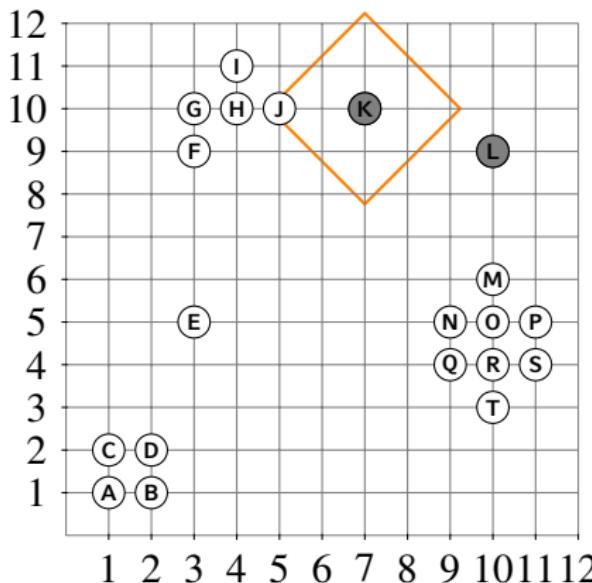
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

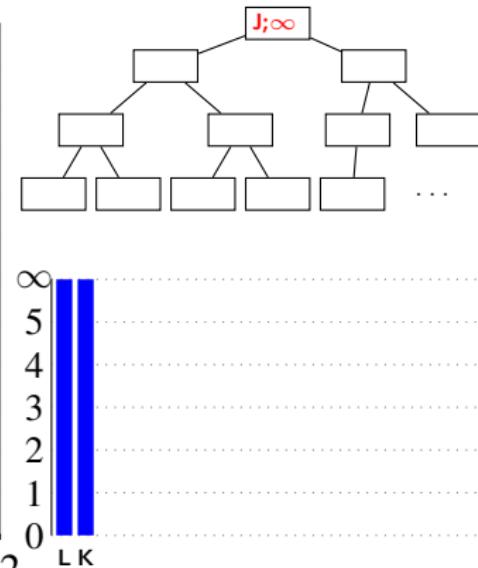
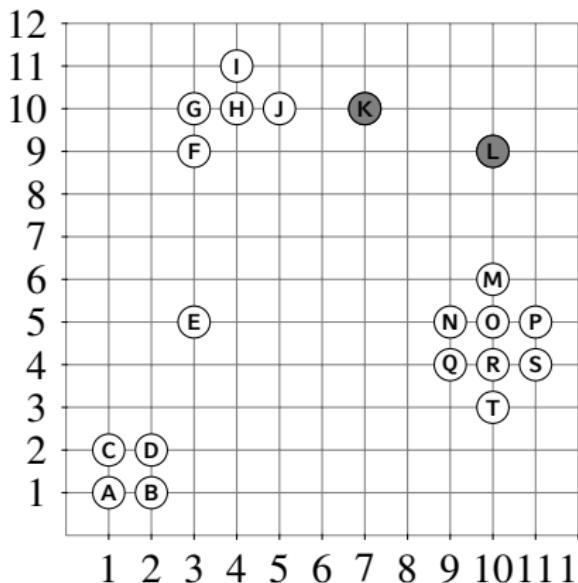
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

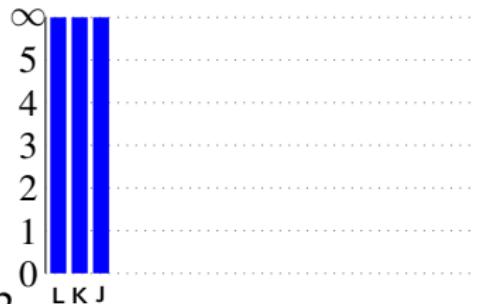
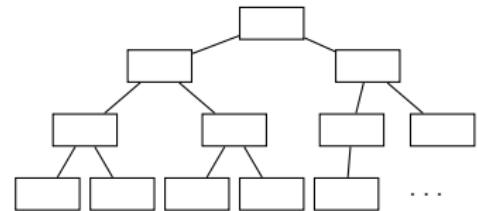
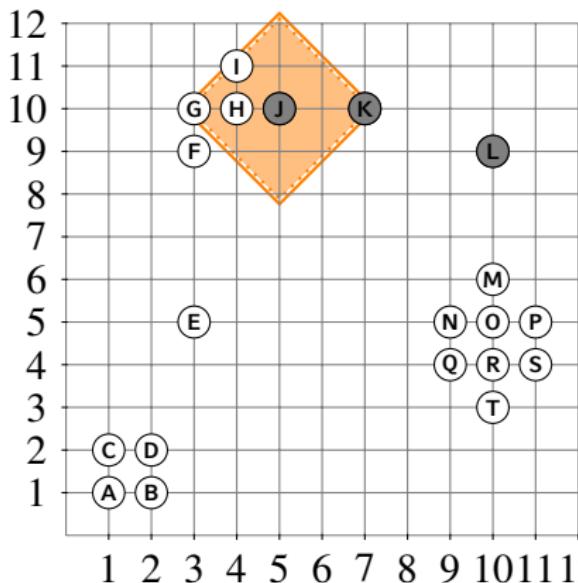
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

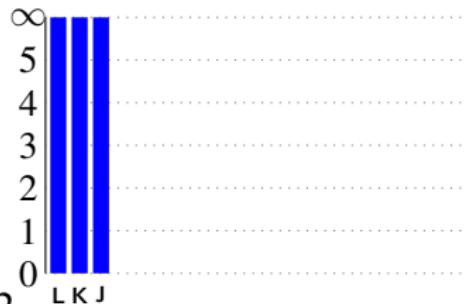
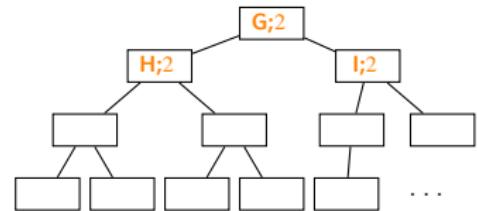
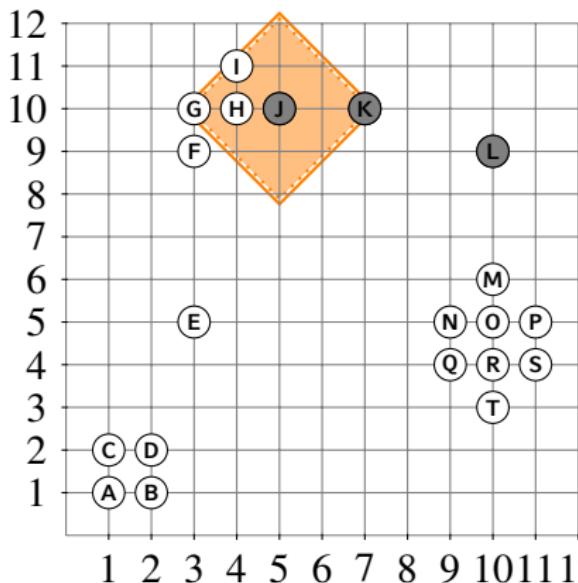
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts= 2 $\varepsilon = 5$,
minPts= 4 $\varepsilon = 2$,
minPts= 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

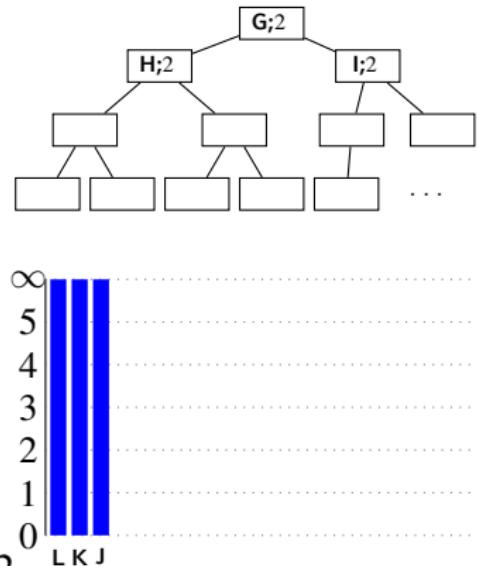
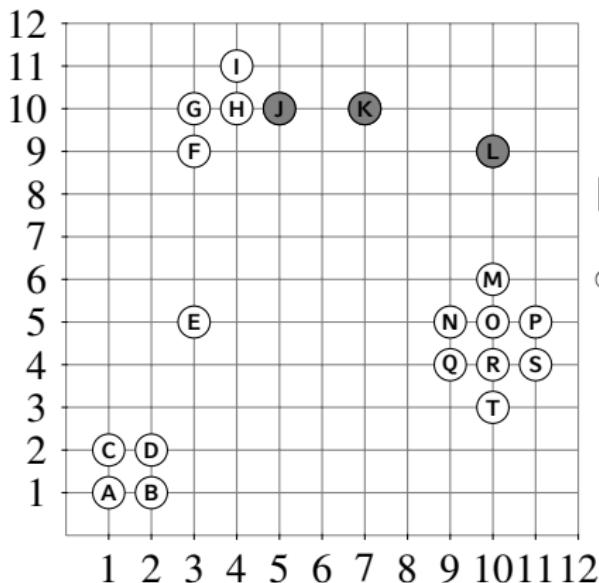
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

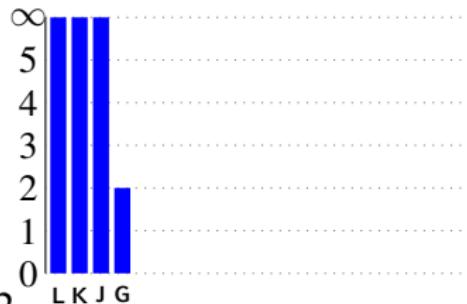
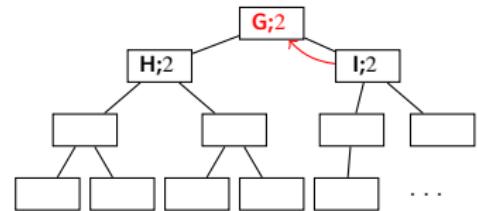
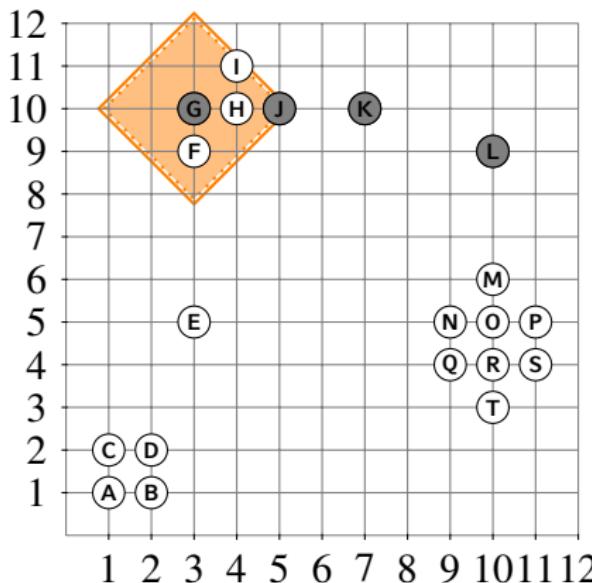
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

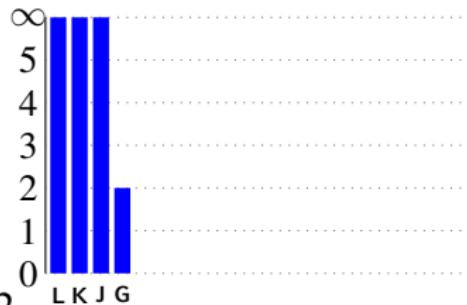
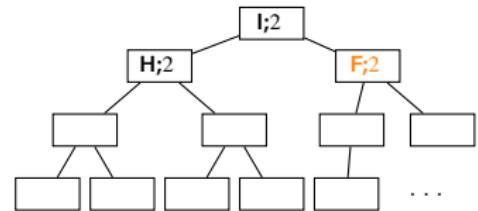
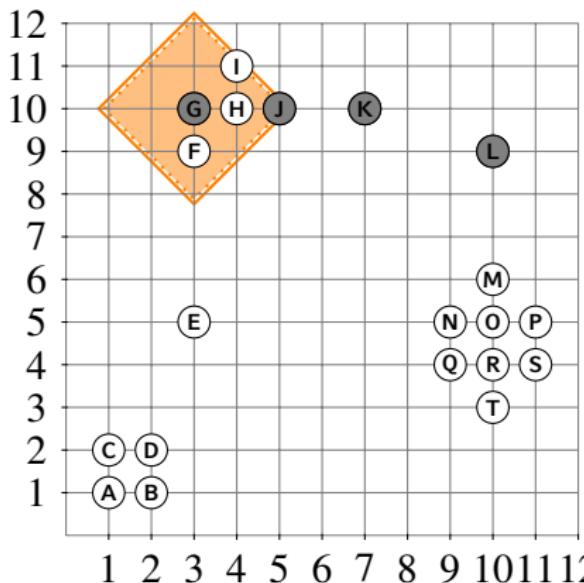
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

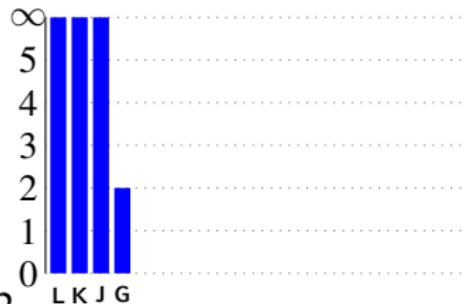
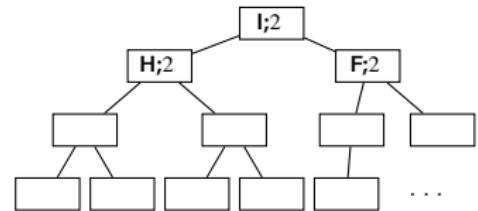
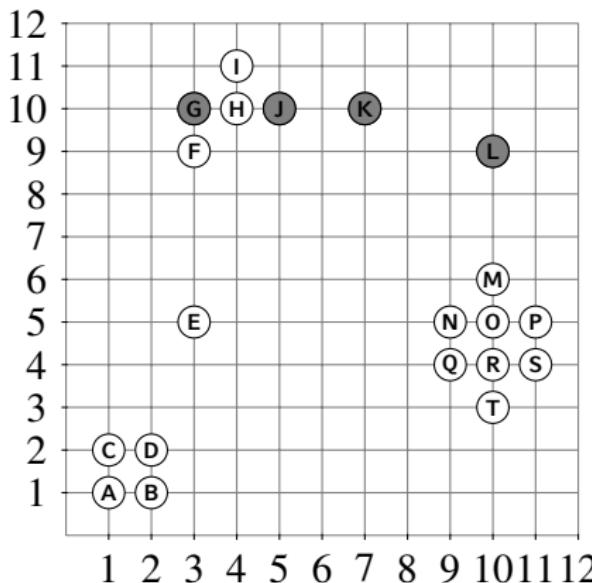
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

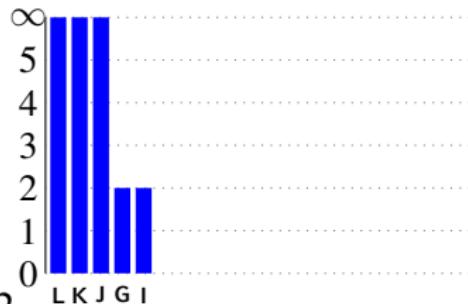
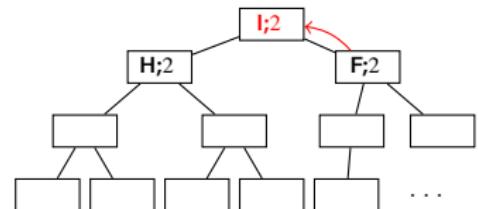
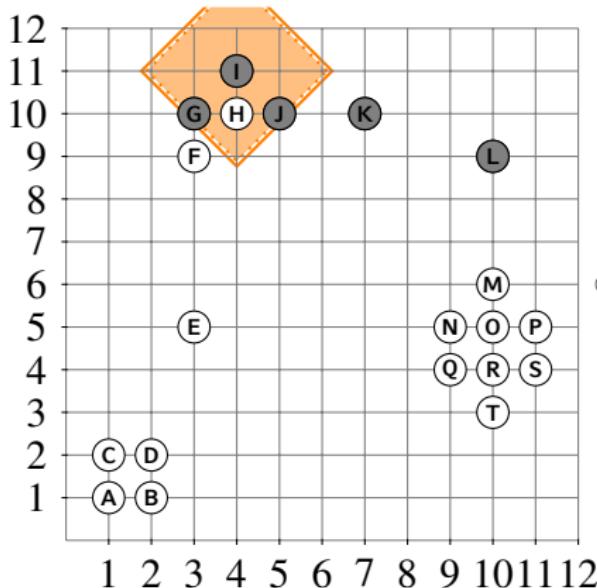
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

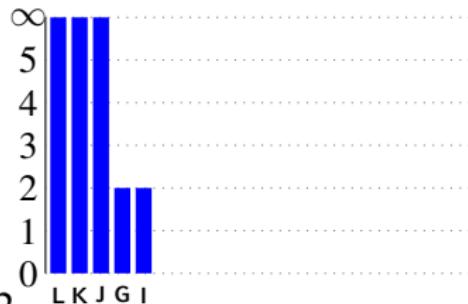
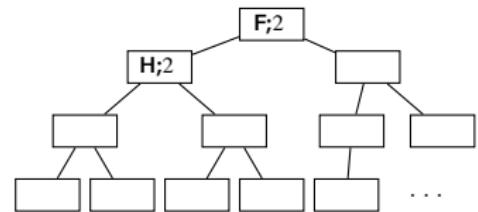
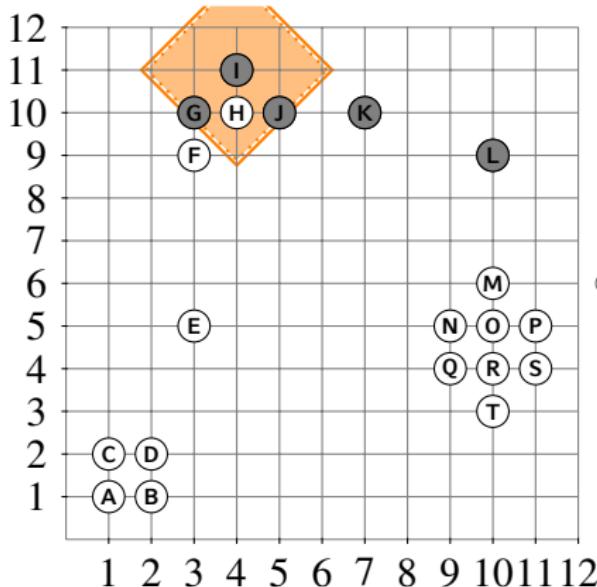
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

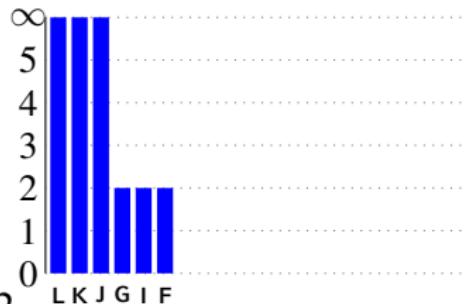
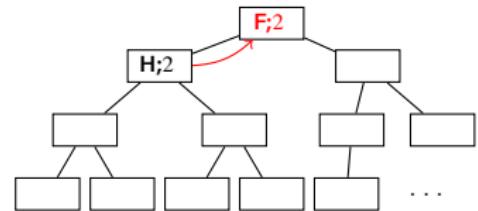
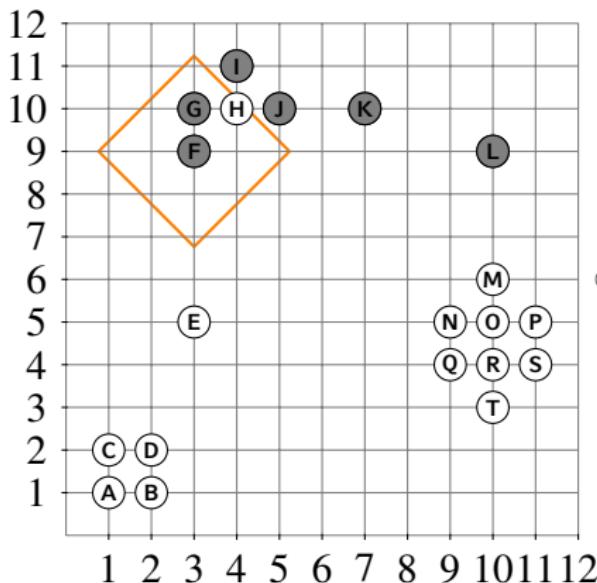
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

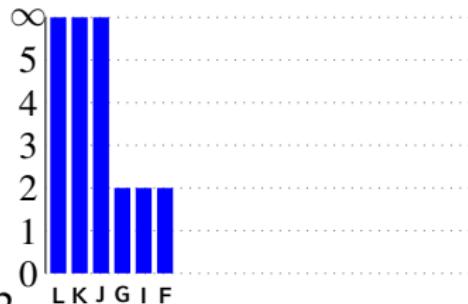
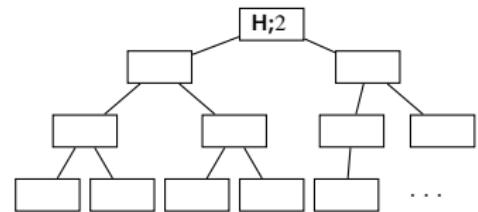
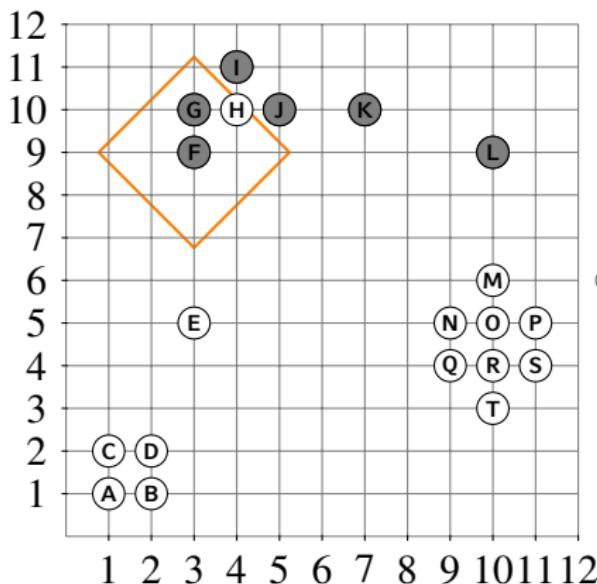
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

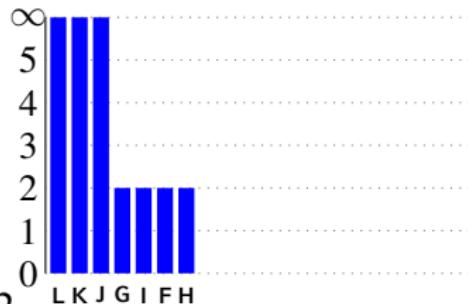
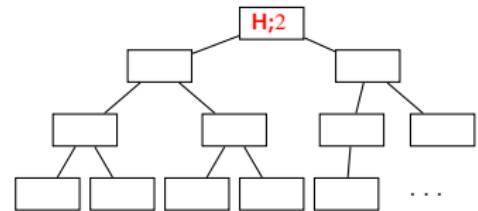
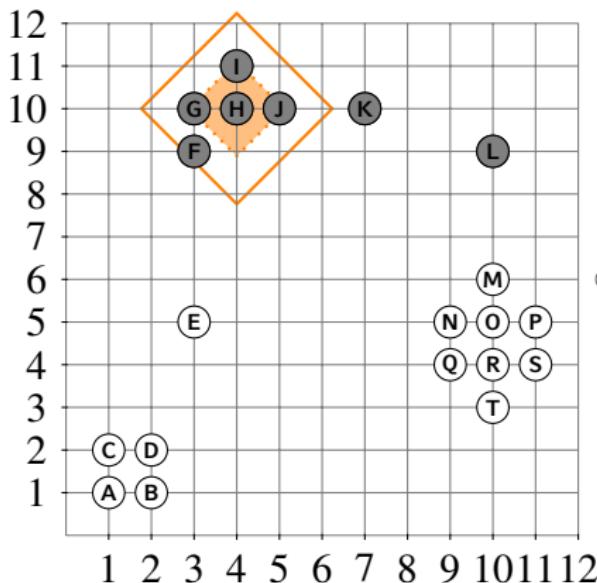
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

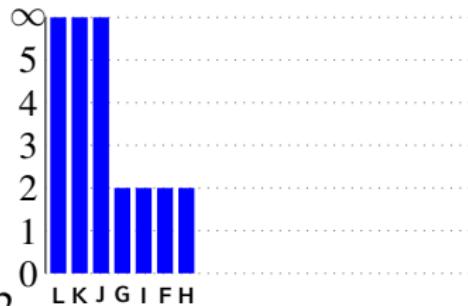
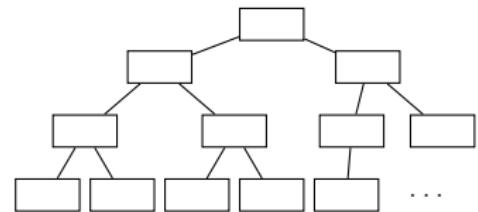
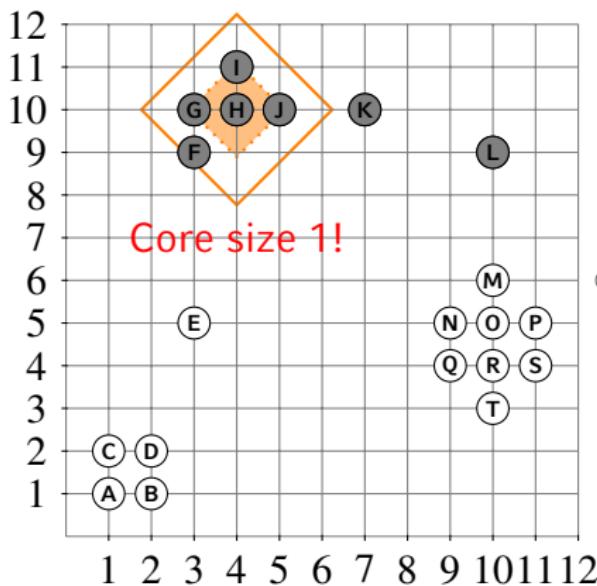
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

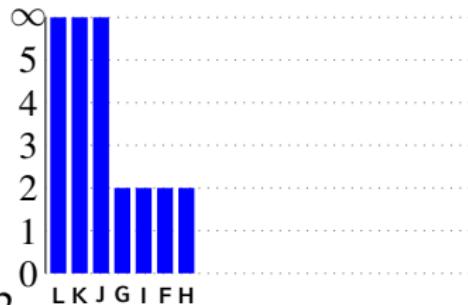
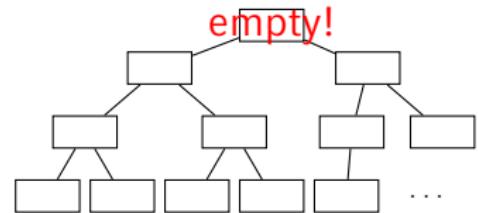
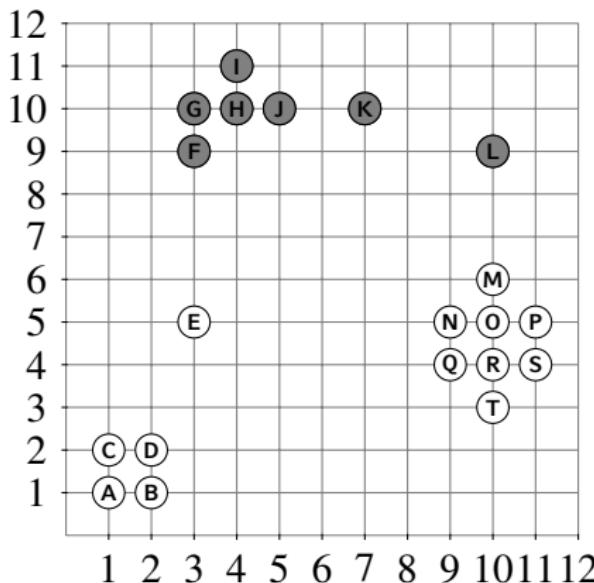
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

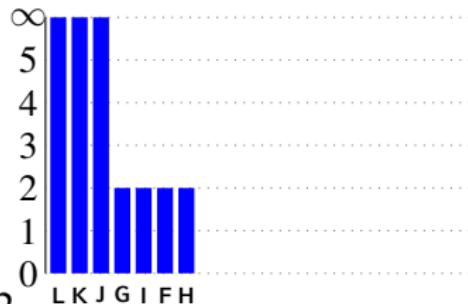
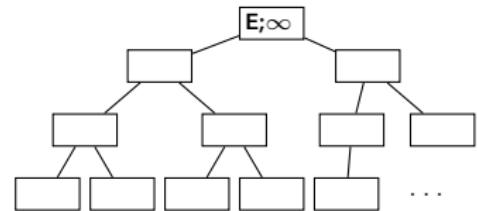
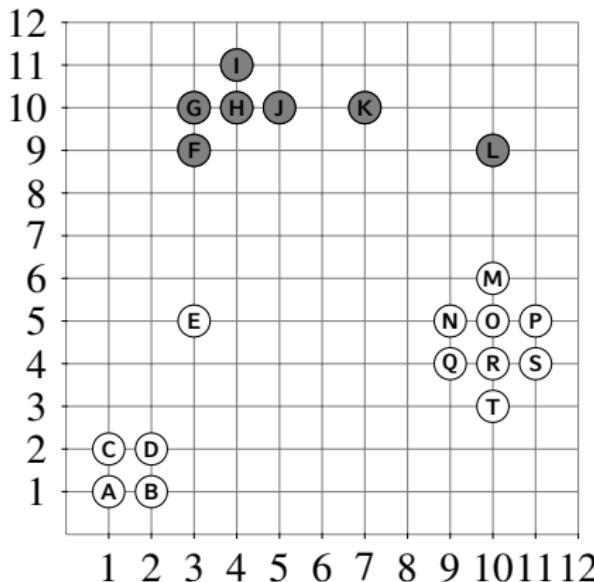
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

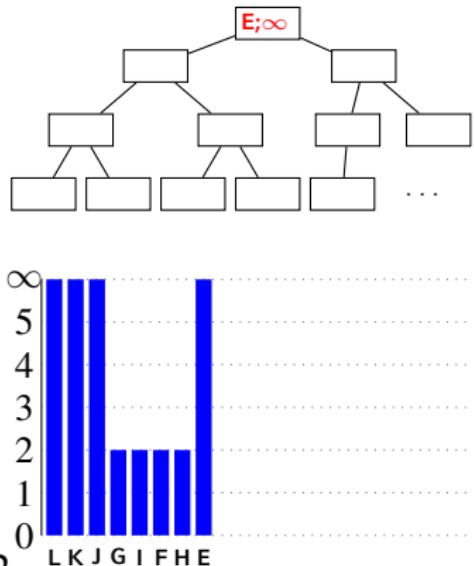
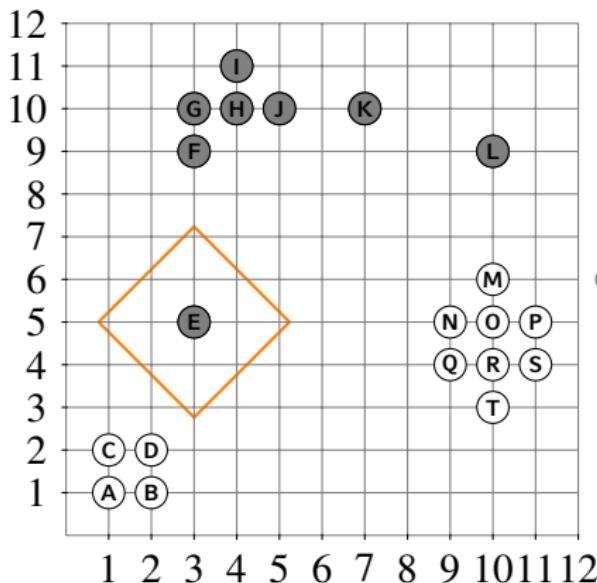
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

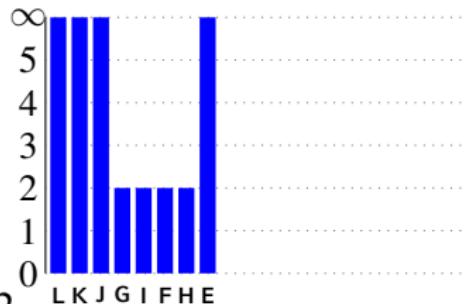
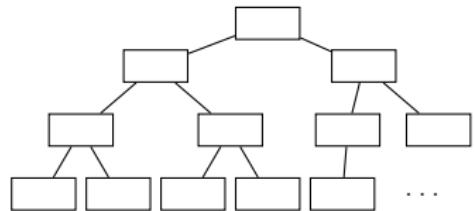
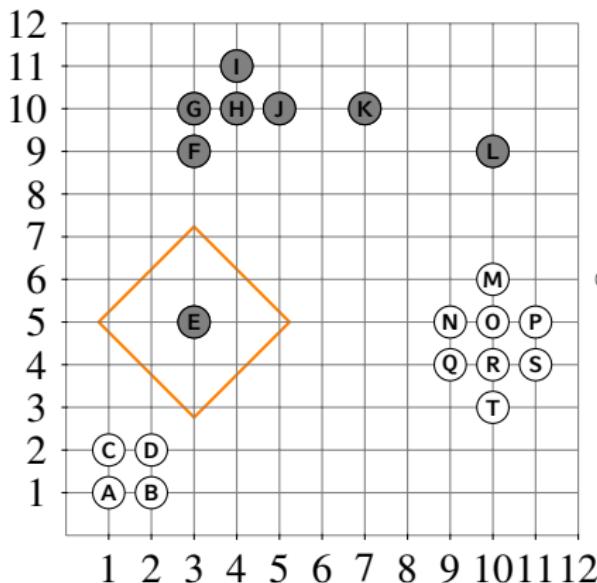
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

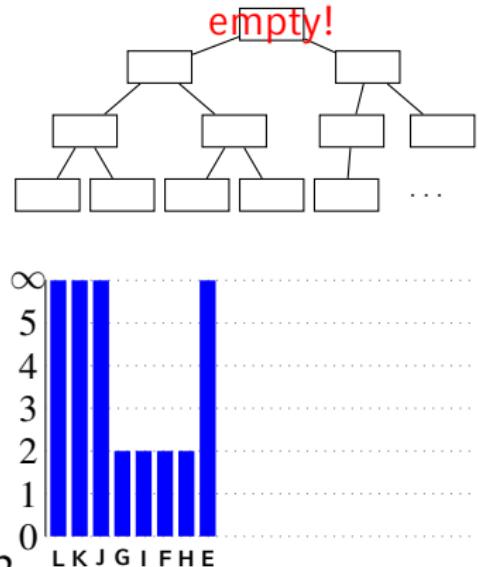
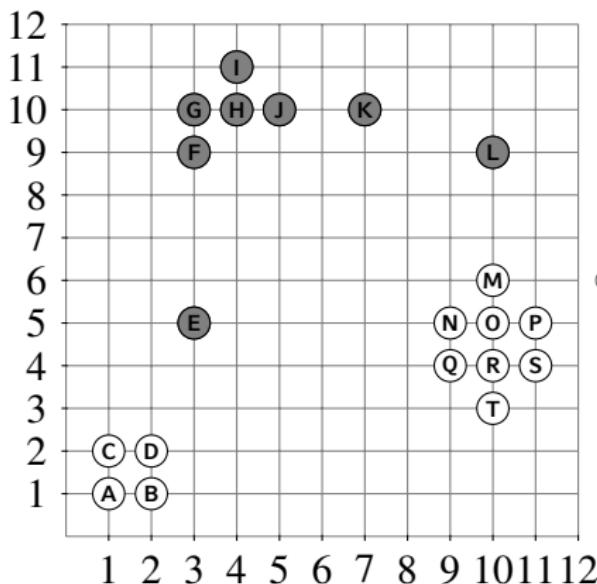
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

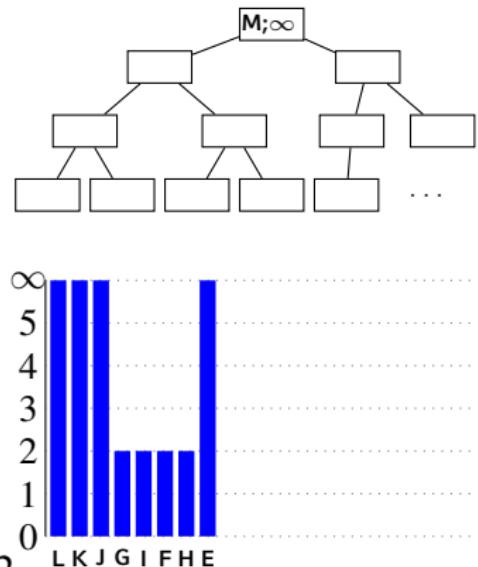
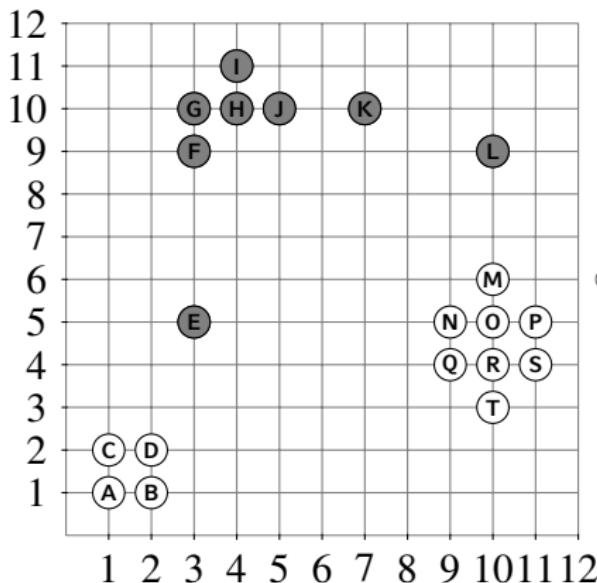
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

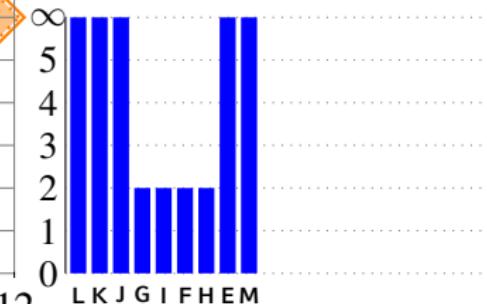
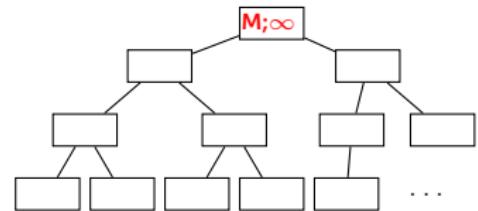
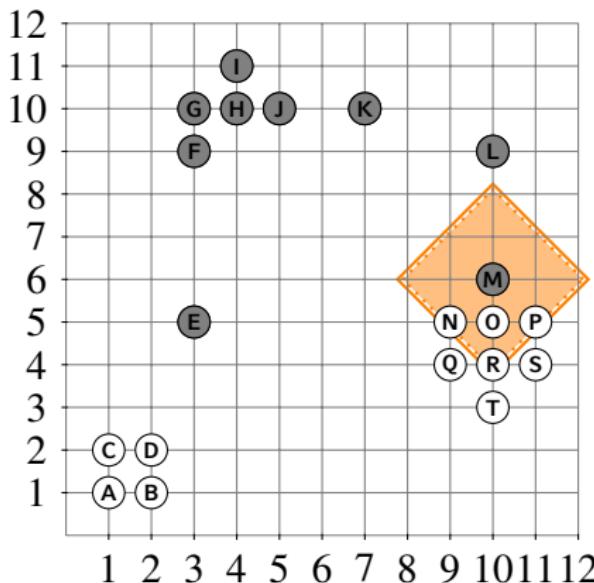
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

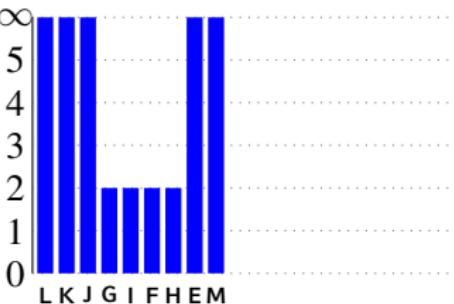
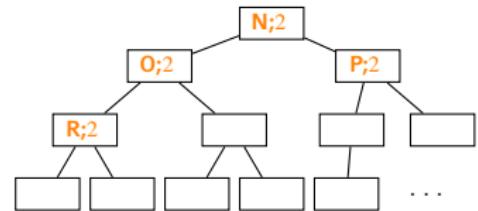
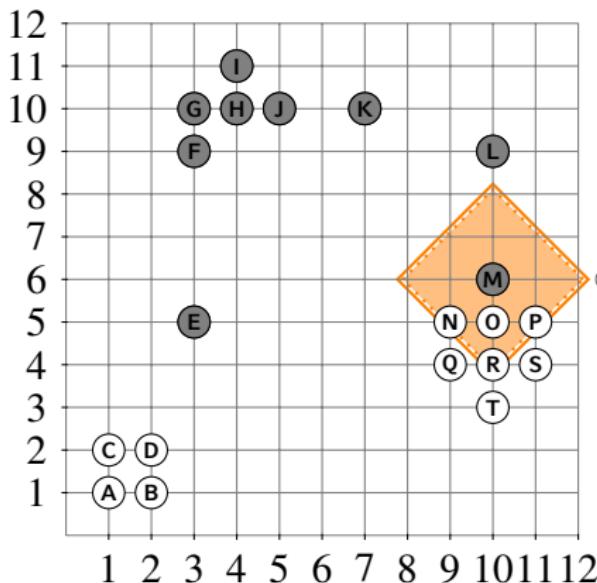
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

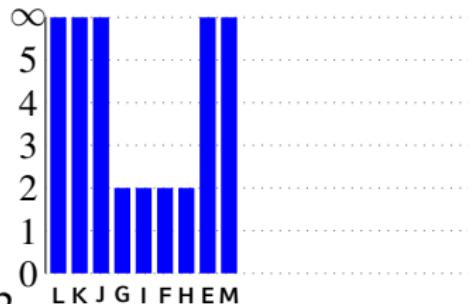
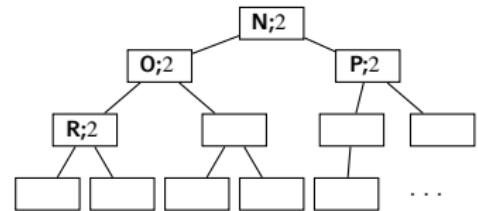
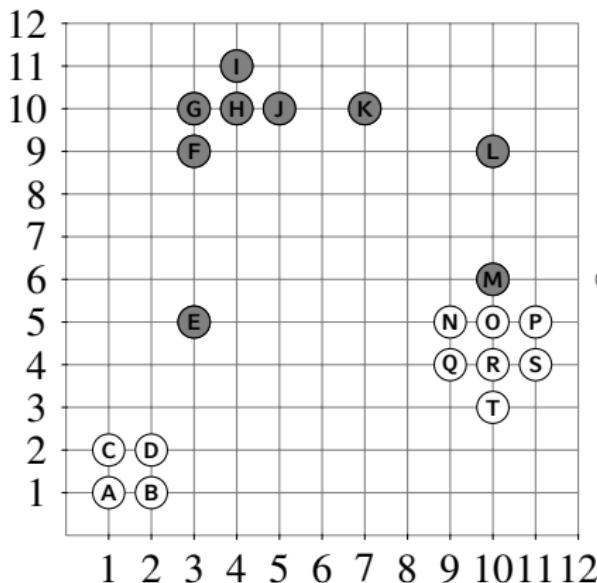
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

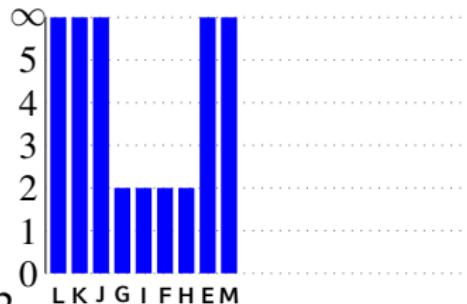
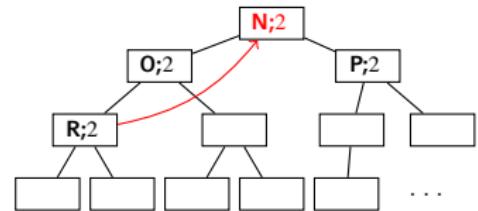
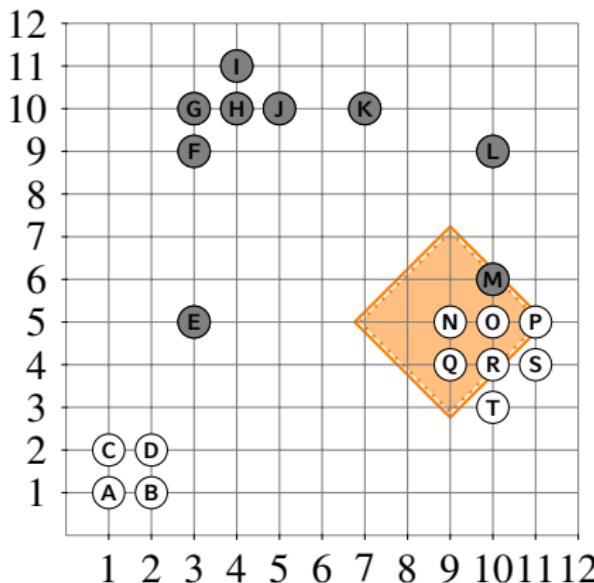
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

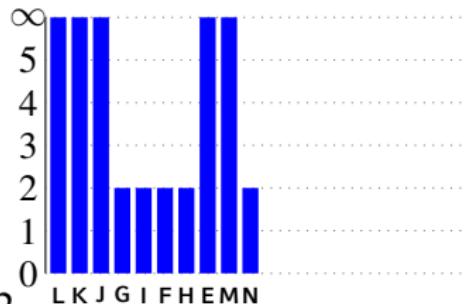
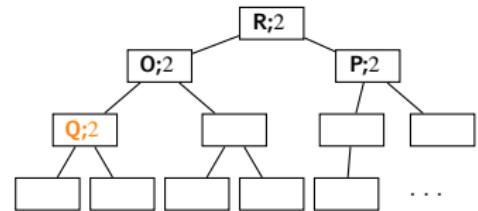
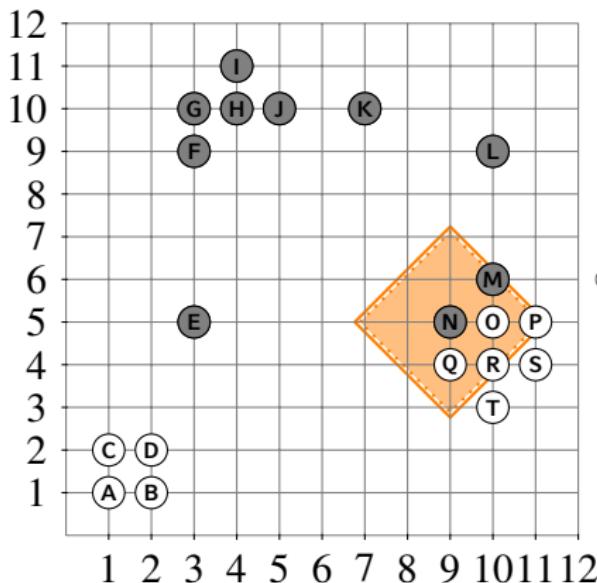
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

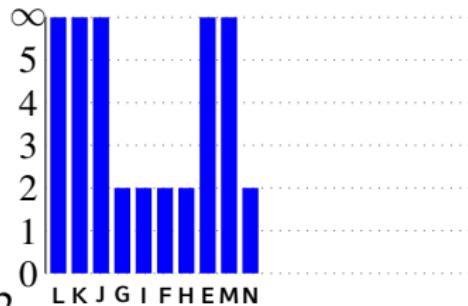
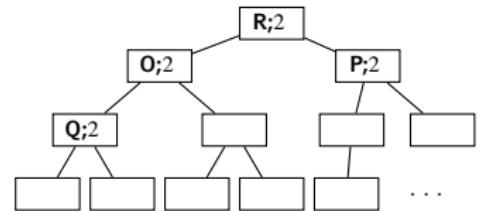
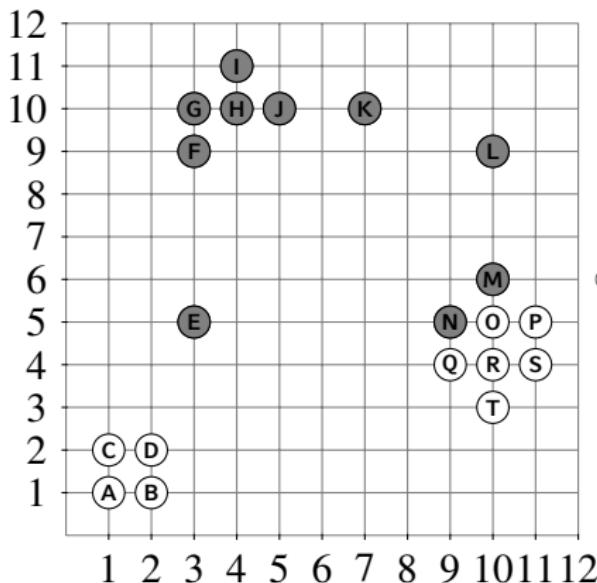
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

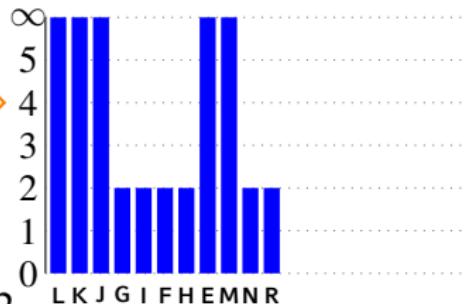
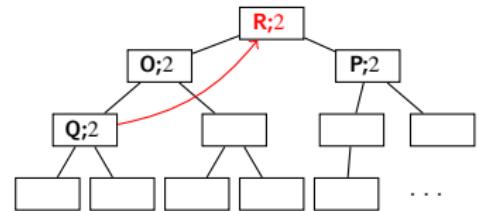
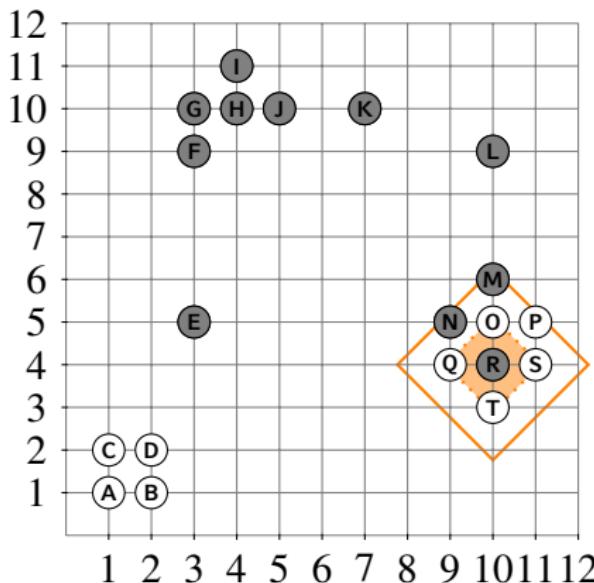
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

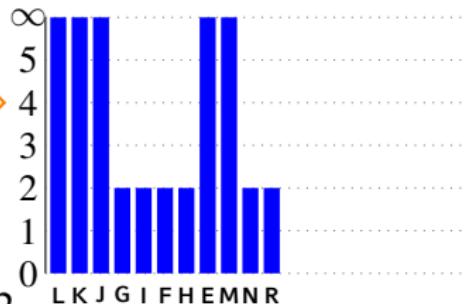
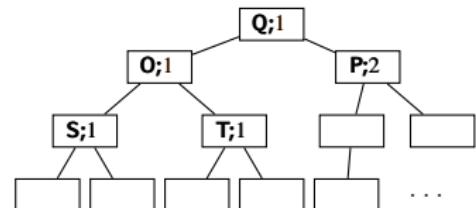
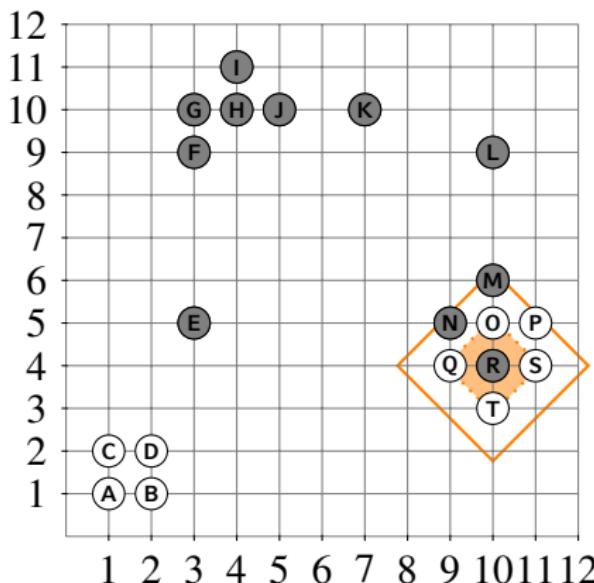
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

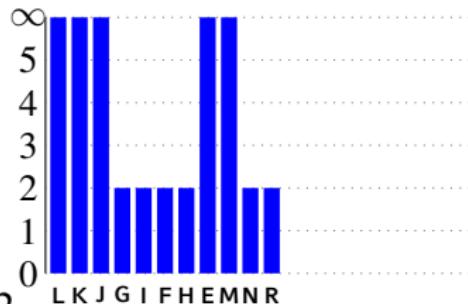
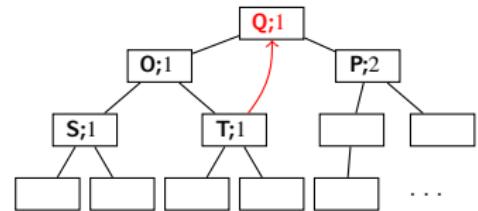
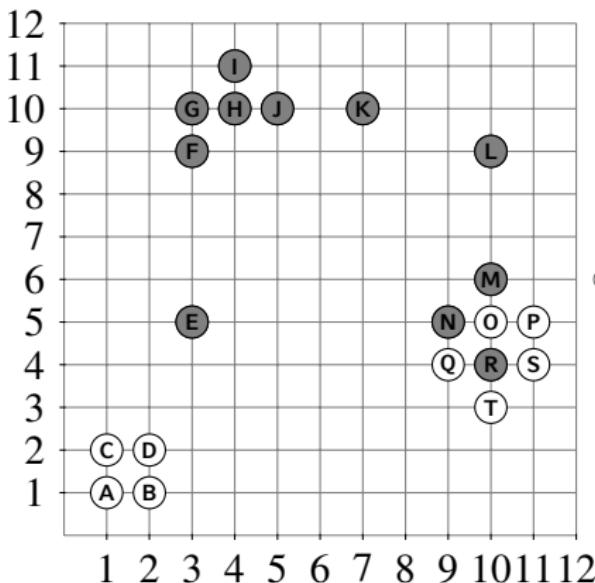
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

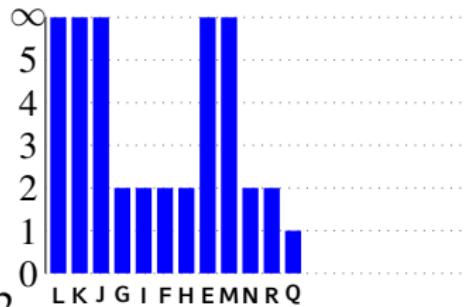
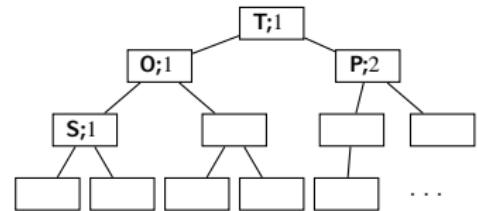
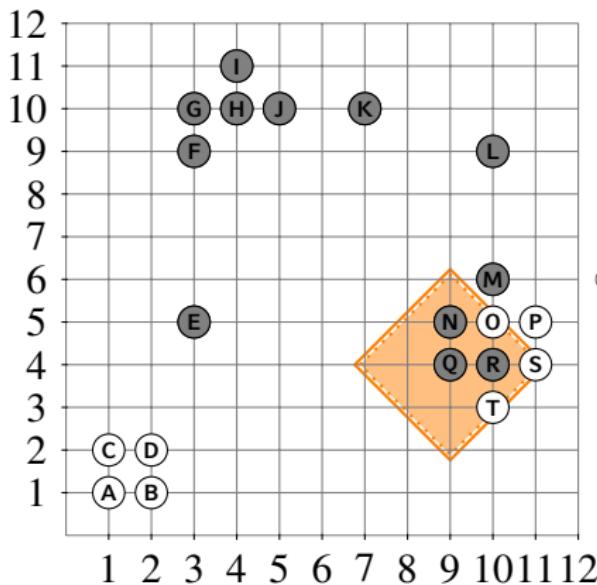
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

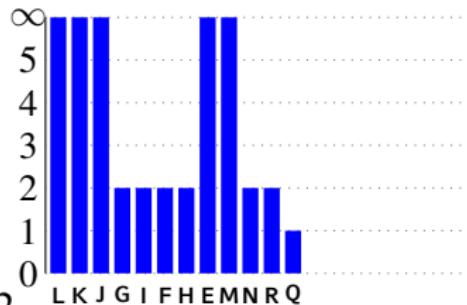
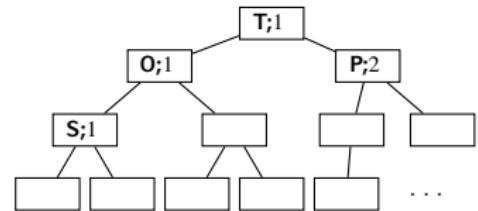
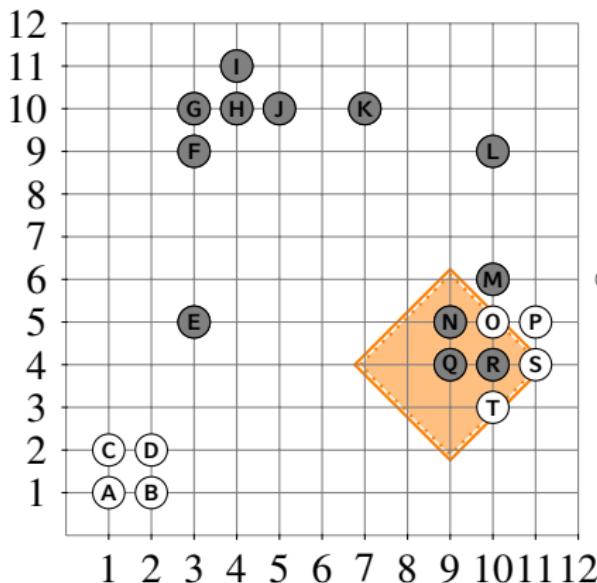
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

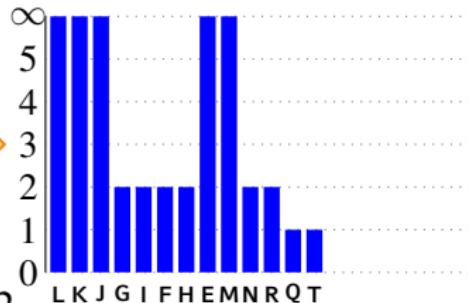
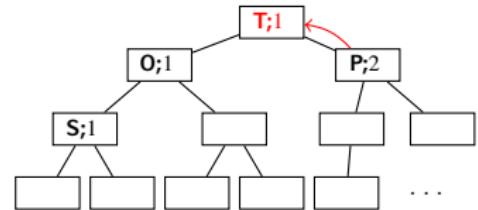
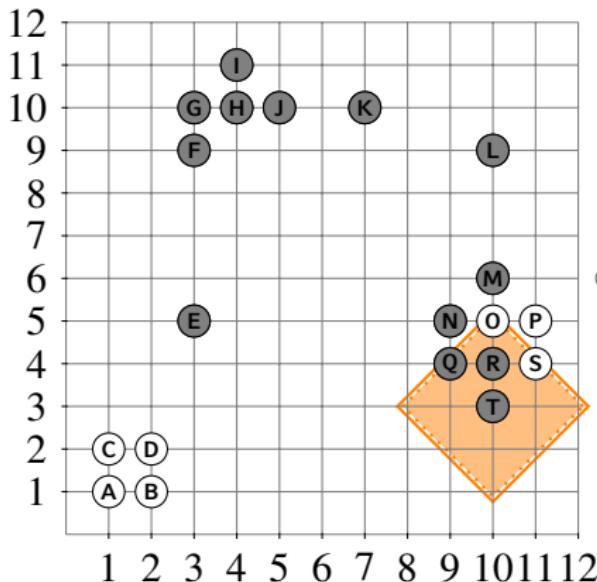
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

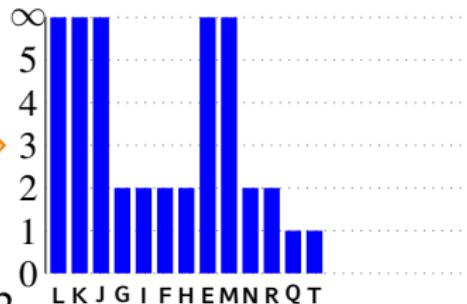
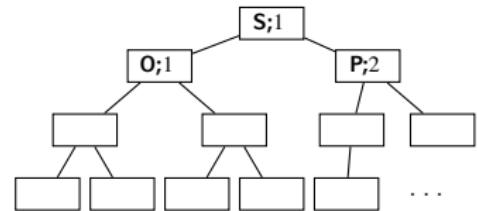
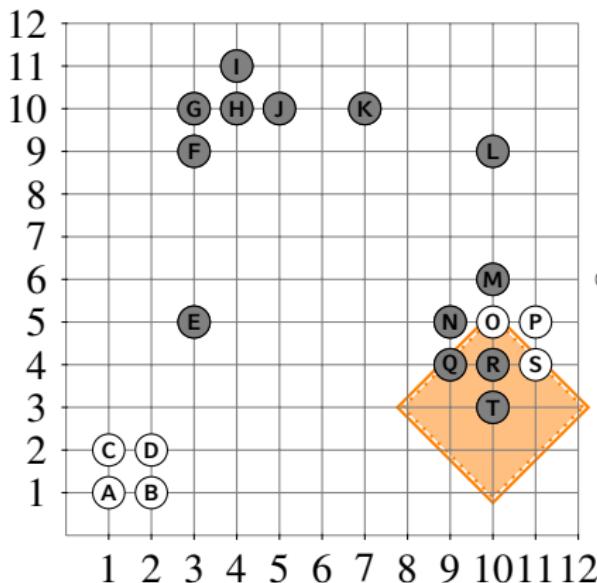
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

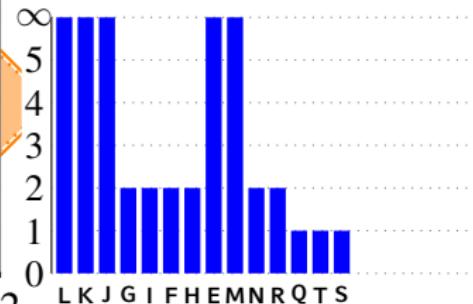
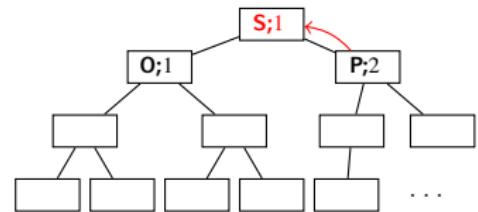
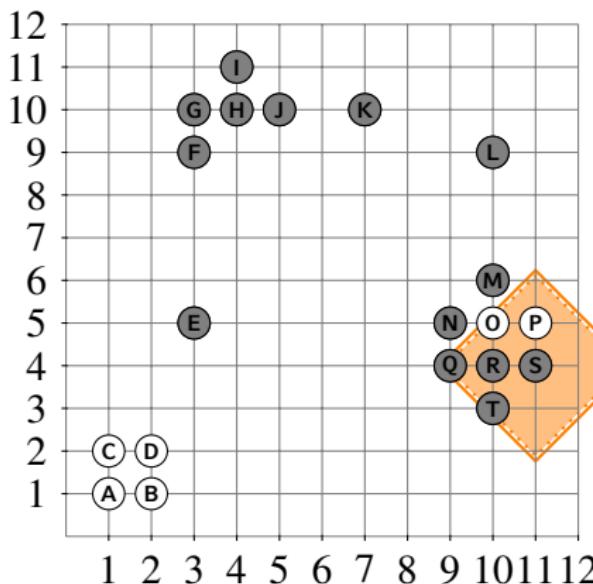
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

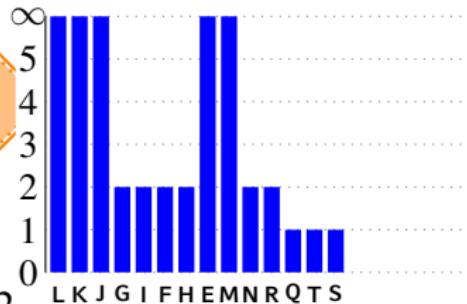
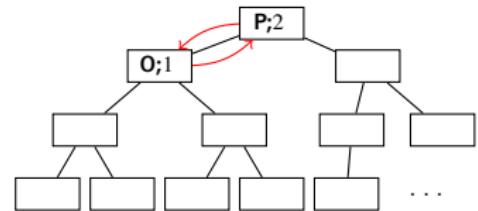
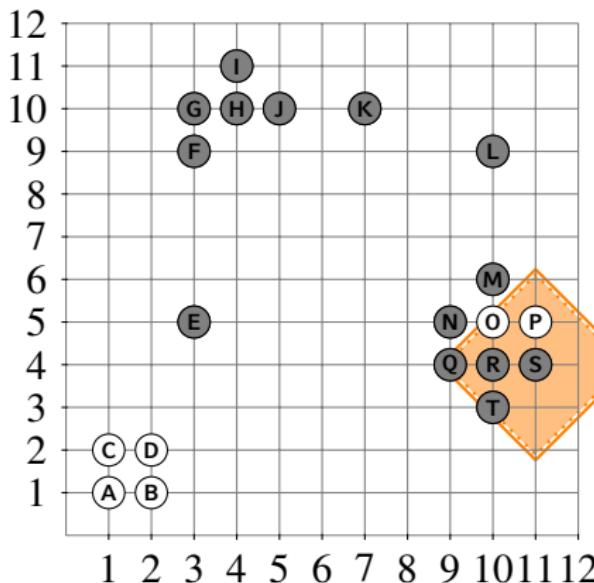
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

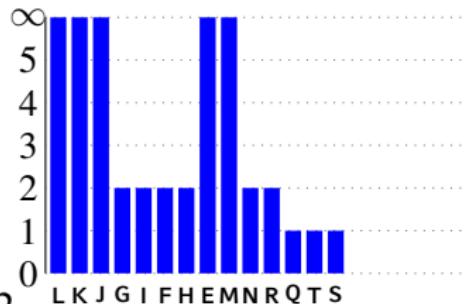
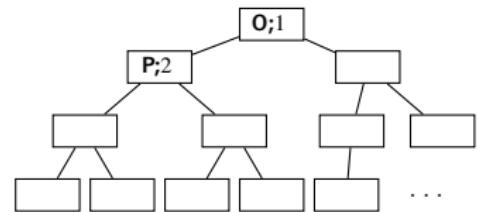
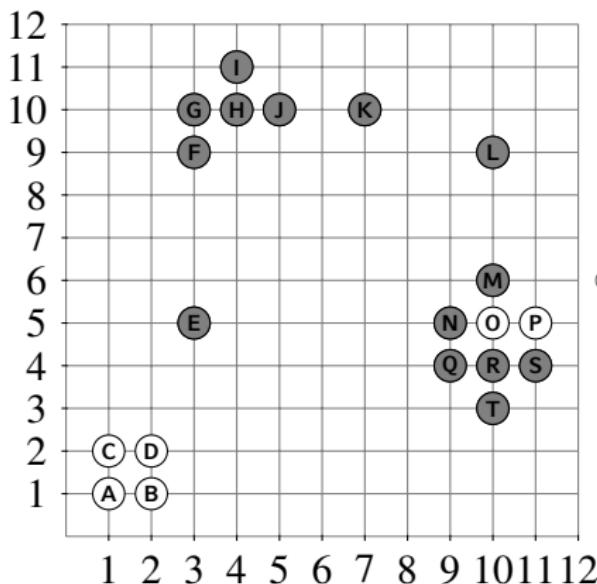
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

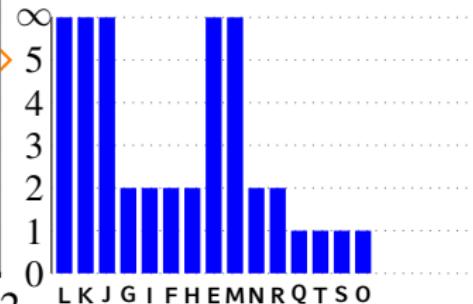
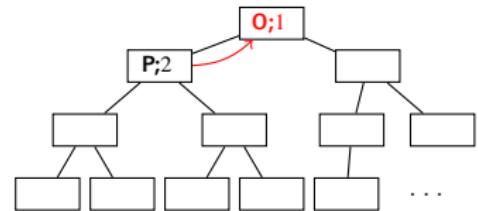
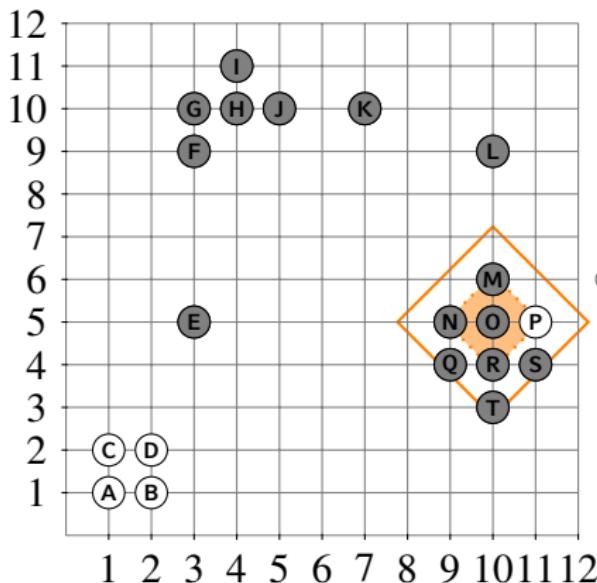
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

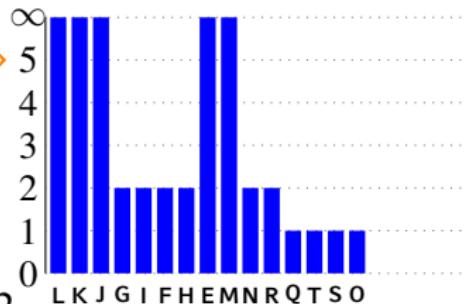
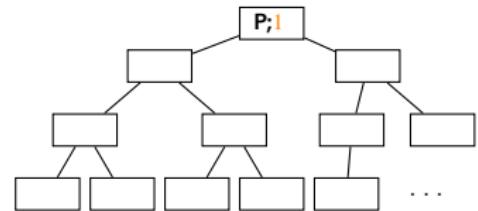
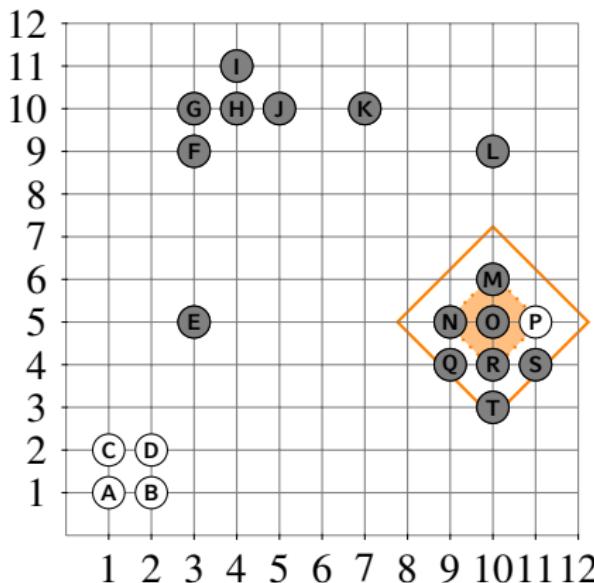
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

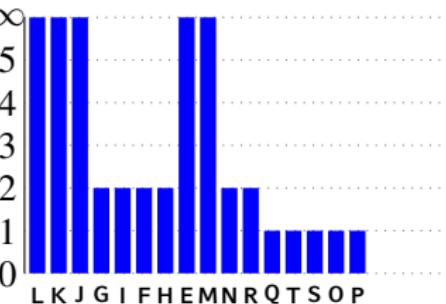
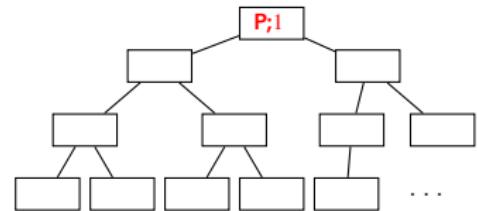
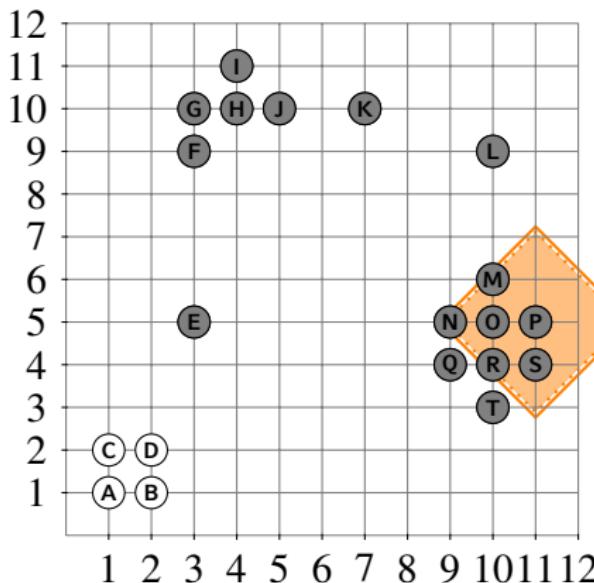
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

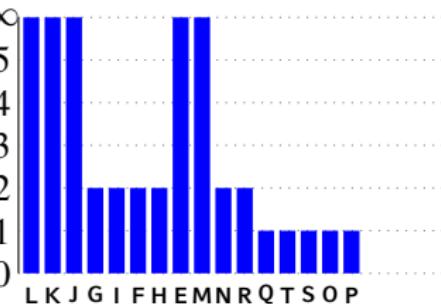
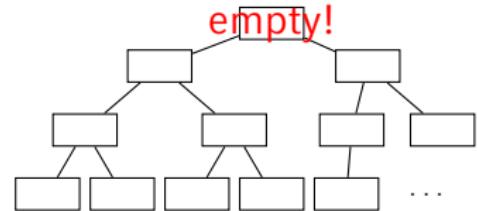
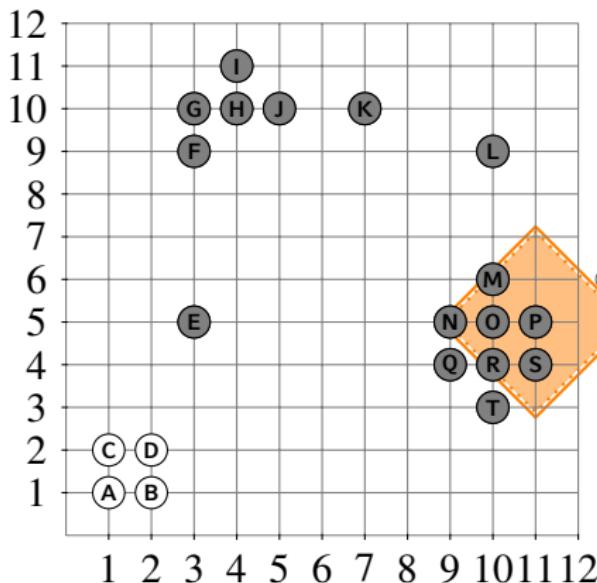
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

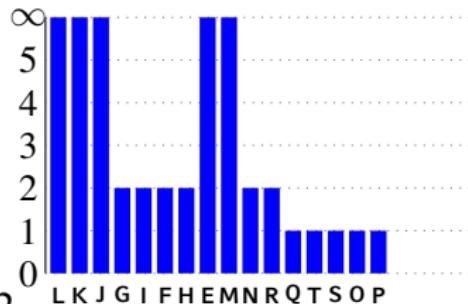
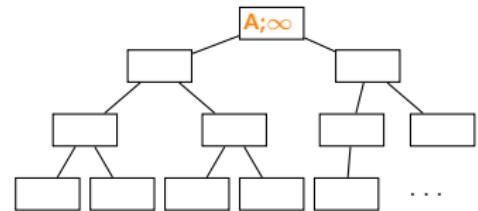
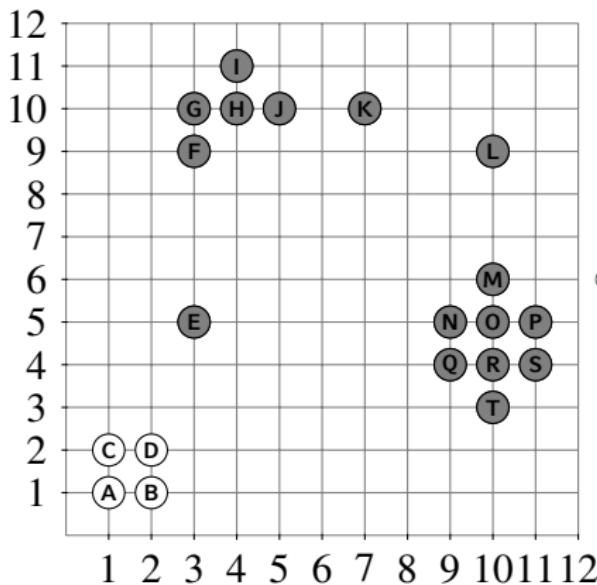
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

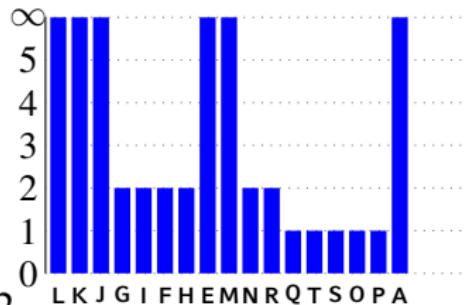
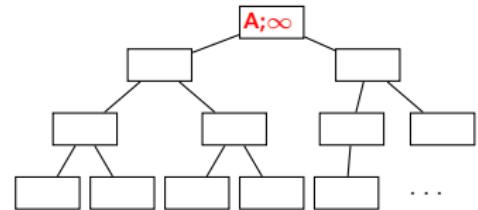
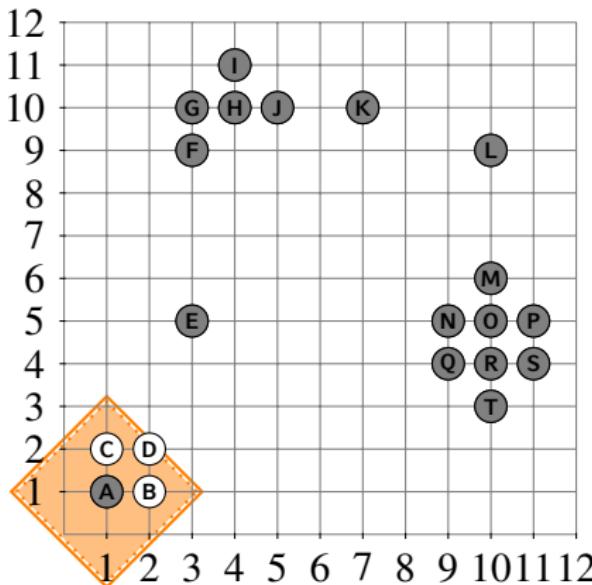
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

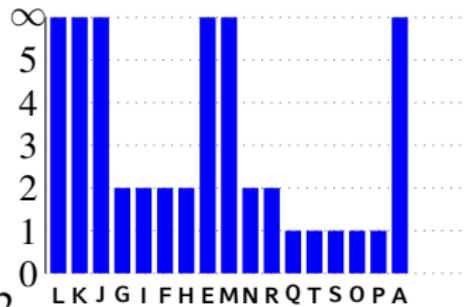
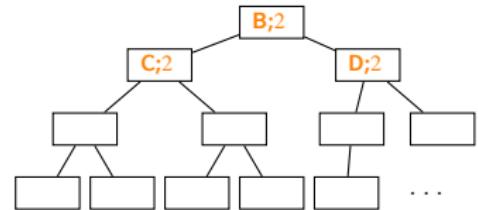
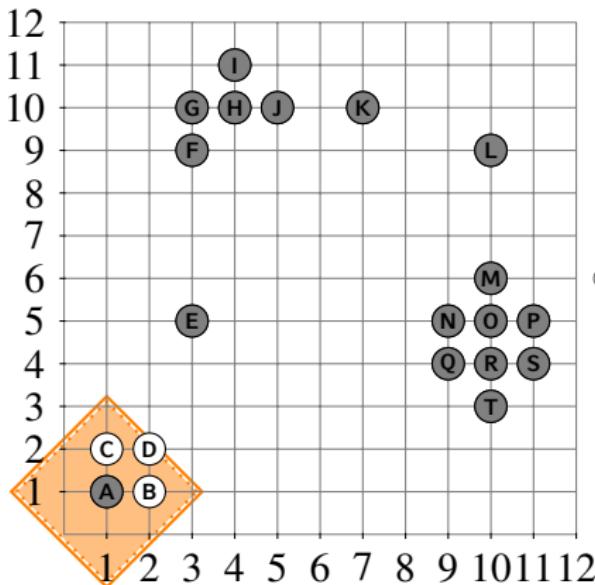
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

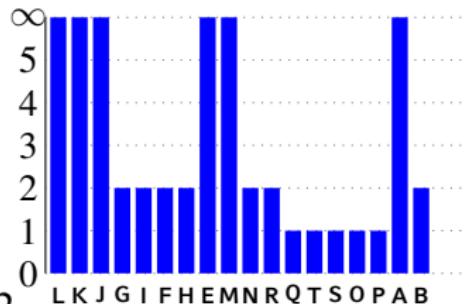
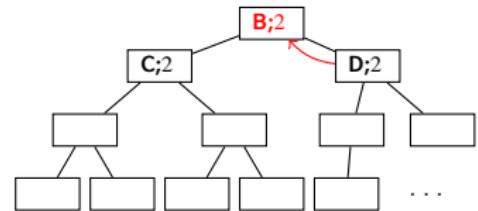
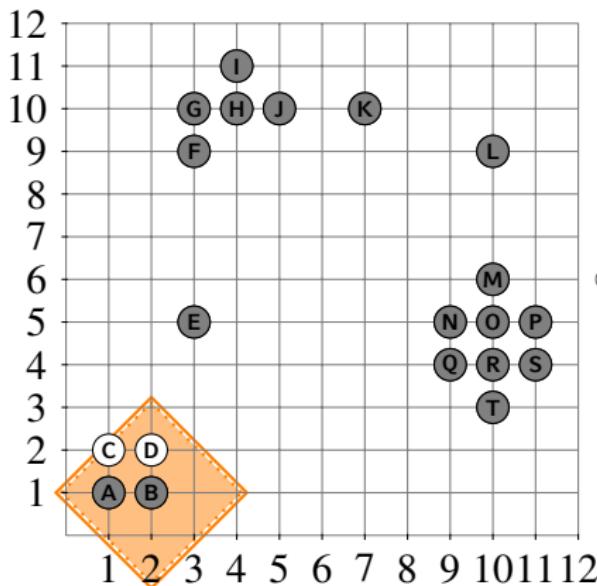
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

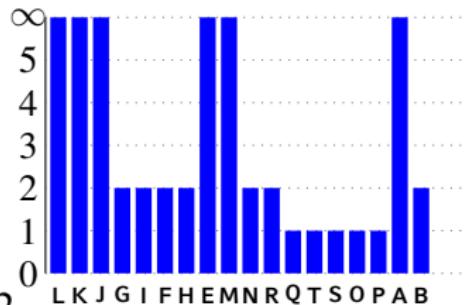
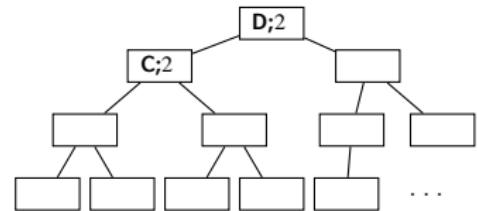
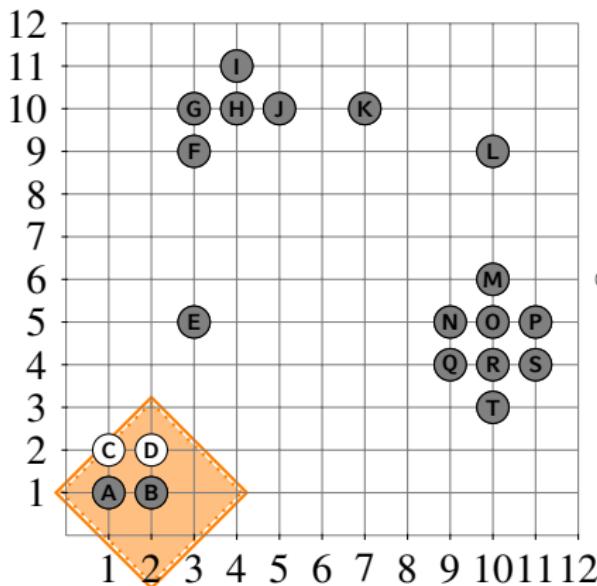
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

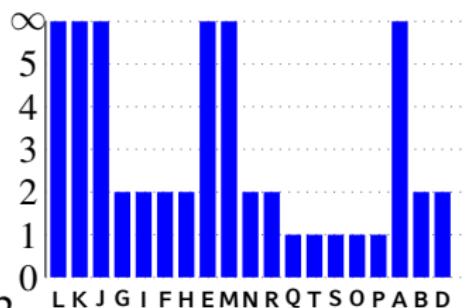
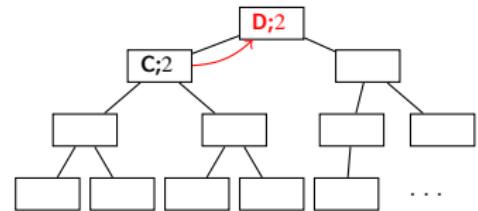
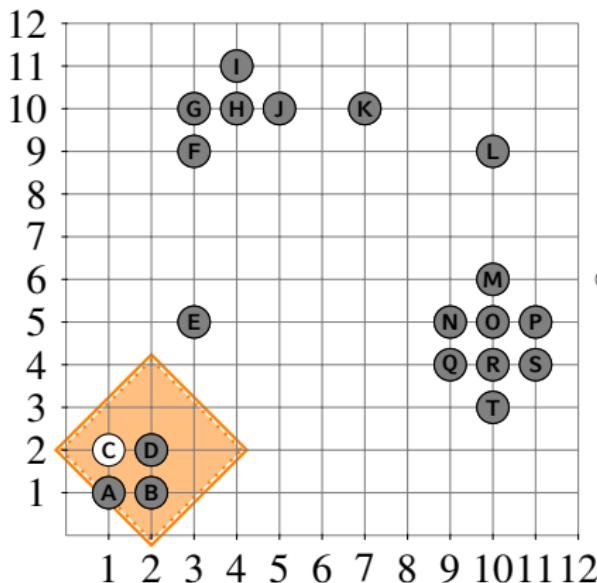
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

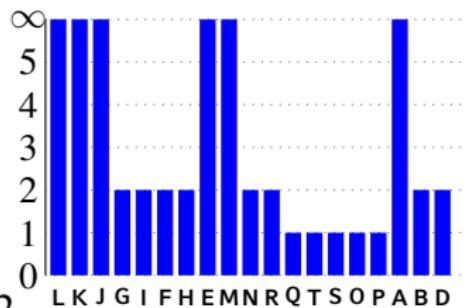
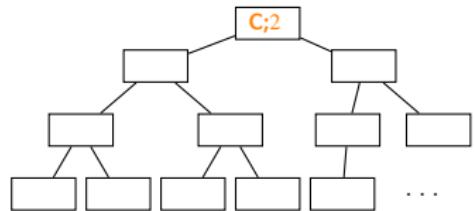
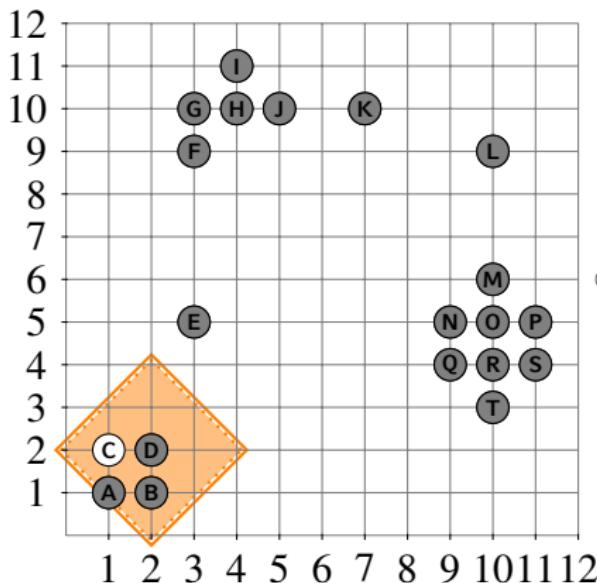
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

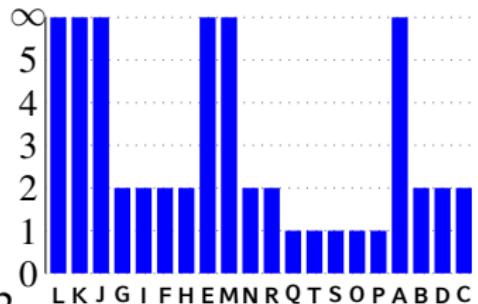
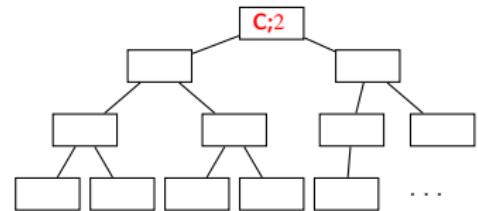
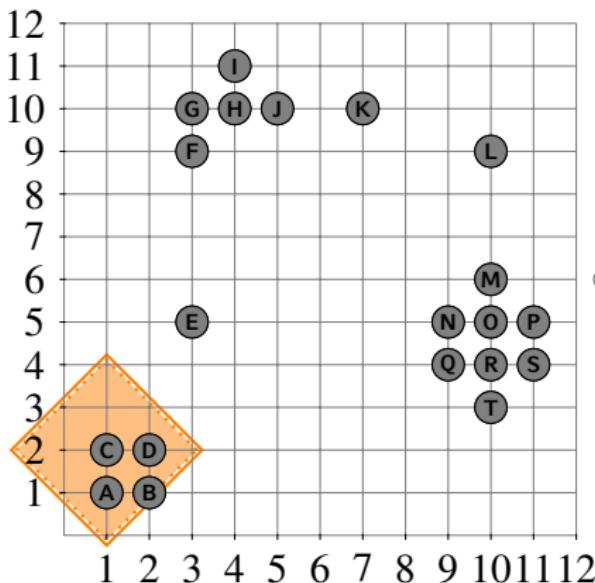
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

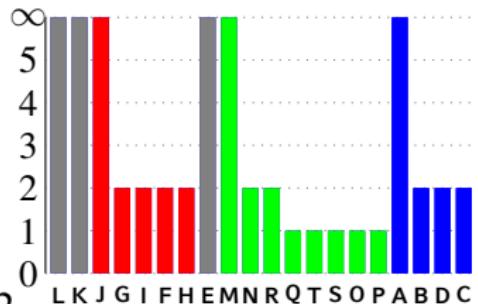
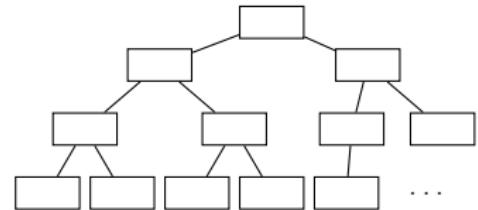
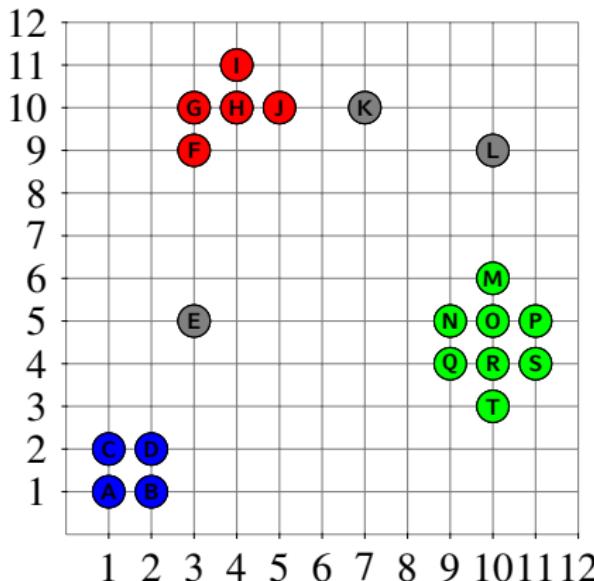
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich

(Intuitive Cluster \approx Täler)

Anfang ("Eingang") gehört i.d.R. dazu, Ende nicht!

Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

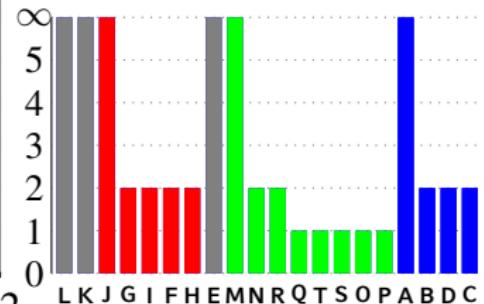
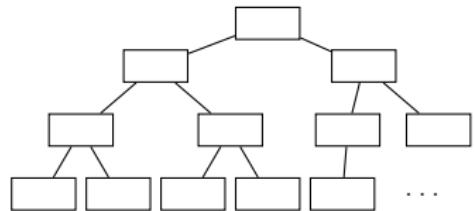
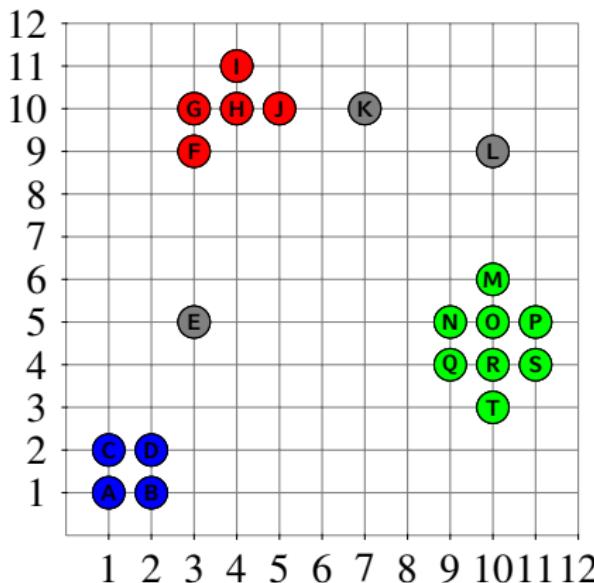
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich



Radius zu klein!

OPTICS – Vergleich

Data Mining
TutorialE. Schubert,
A. Zimek

Aufgabe 4-1

single-link
average-link
complete-link

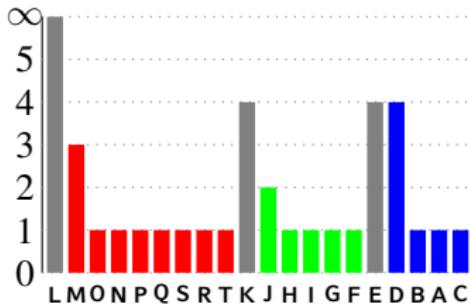
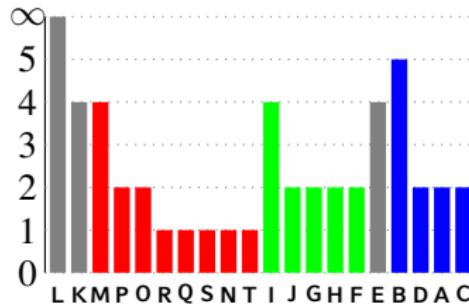
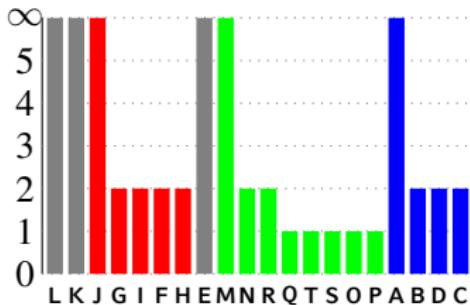
Aufgabe 4-2

DBSCAN und
Single-Link

Aufgabe 4-3

 $\varepsilon = 5$,
minPts = 2 $\varepsilon = 5$,
minPts = 4 $\varepsilon = 2$,
minPts = 4

Vergleich

 $\varepsilon = 5, \text{ minPts}=2$  $\varepsilon = 5, \text{ minPts}=4$  $\varepsilon = 2, \text{ minPts}=4$  $\varepsilon = \infty, \text{ minPts}=2$ 