

Clustering Analysis

By Karis Kim

Clustering:

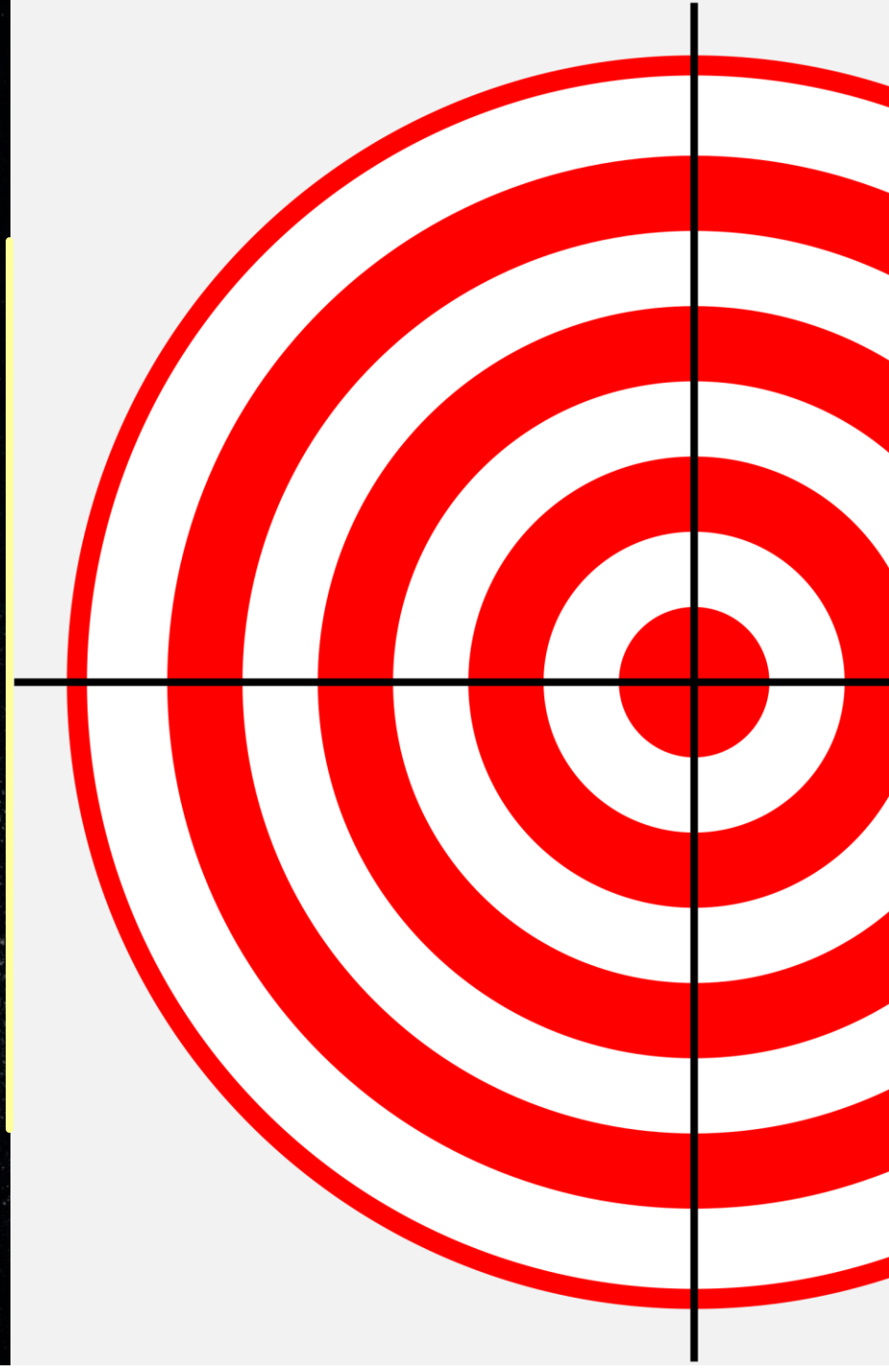
/ˈkləstərɪŋ/

Process of finding
meaningful groups
in data



Goal:

Exploring,
not predicting



Applications of Clustering

Describing

1 Marketing

2 Document Clustering

3 Session Grouping

Preprocessing

1 Reduce Dimensionality

2 Object Reduction

Clustering Types

1

Exclusive/Strict
Partitioning

3

Hierarchical

2

Overlapping/
Multiview

4

Fuzzy/
Probabilistic

Clustering Algorithm Types

1

**Prototype/
Centroid/
Center
Based**

2

Density

3

Hierarchical

4

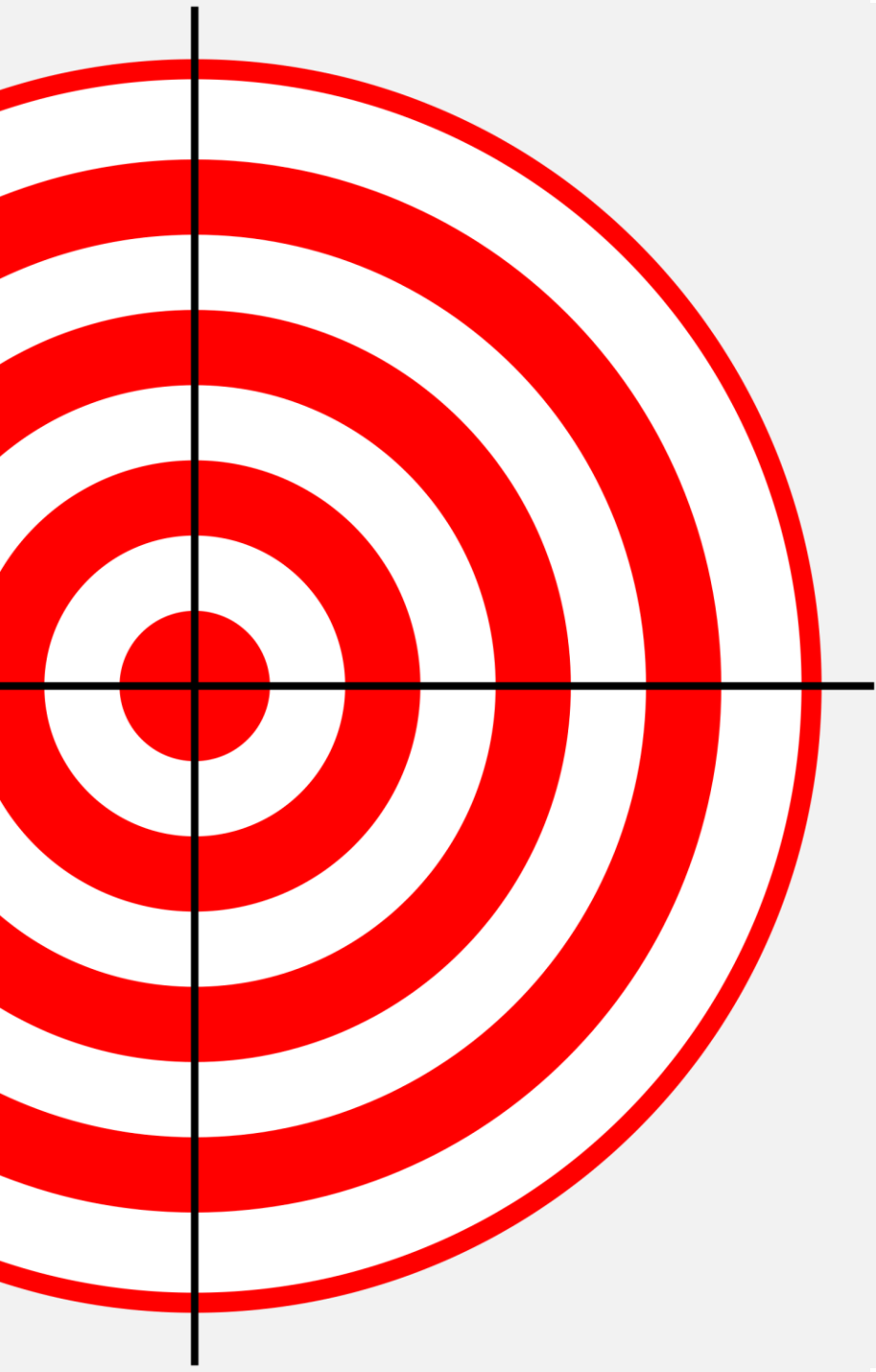
**Model/
Distribution
Based**



k-Means:

/k-meens/

Data set is divided
into user-specified
 k clusters around
the nearest centroid

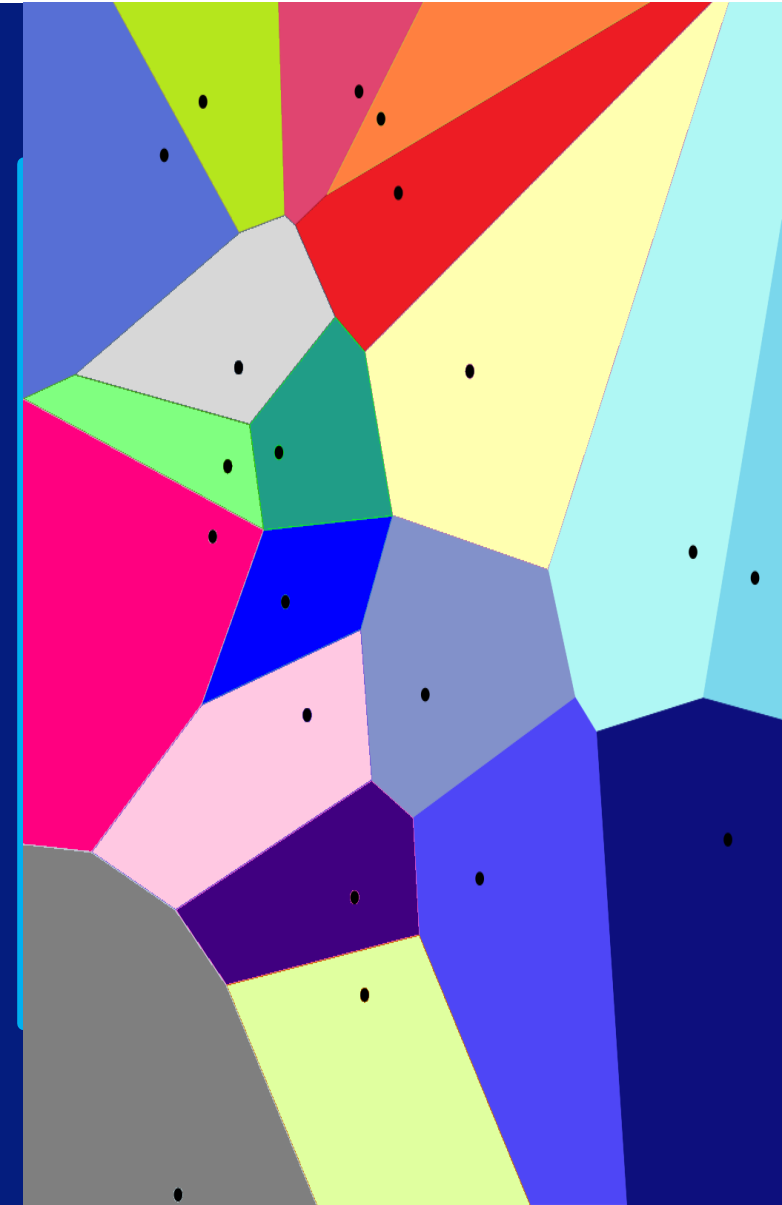


Goal:

To find the
prototype data point
for each cluster

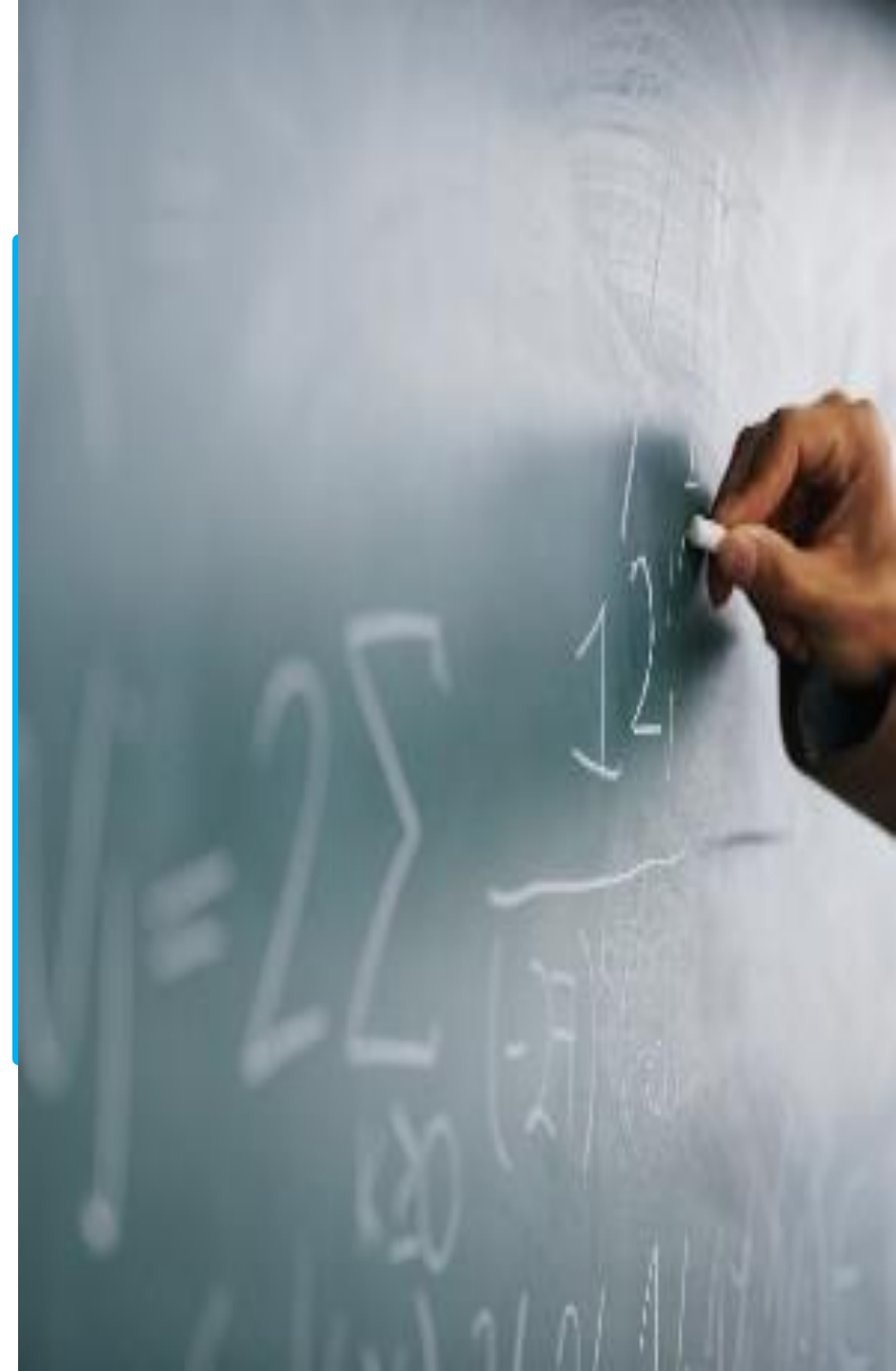
k-Means Process

1. Set k # of clusters,
initiate k random centroids
2. Assign data points to nearest centroid
3. Find new centroids (most representative)
as centroid w/minimal SSE
= new mean of cluster
4. Repeat step 2 and 3
5. When no significant change,
declare final centroid as prototype



HOW TO PARTITION?

Define a proximity measure
using Euclidean distance



File Edit Process View Connections Cloud Settings Extensions Help

Views: Design Results Turbo Prep More Find data, operators...etc All Studio

Repository

- Import Data
- Assgmt5-HouseholdP
- Chapter05DataSet (SK
- Presentation-3flAtrium

Operators

performance

- Performance (Support Vec
- Performance (Attribute Co
- Segmentation (4)
- Cluster Count Performanc
- Cluster Distance Performa
- Cluster Density Performar
- Item Distribution Performa

Process

100%

Retrieve Presentati... Normalize Clustering Performance

Process diagram showing a flow from Retrieve Presentati... to Normalize to Clustering to Performance. The Performance operator has multiple outputs labeled res.

Parameters

Process

- logverbosity: init
- logfile:
- resultfile:
- random seed: 2001
- send mail: never
- encoding: SYSTEM

[Hide advanced parameters](#)

[Change compatibility \(9.1.000\)](#)

Result History

Cluster Model (Clustering)

ExampleSet (//Local Repository/data/Presentation-3f/Atrium)

Description

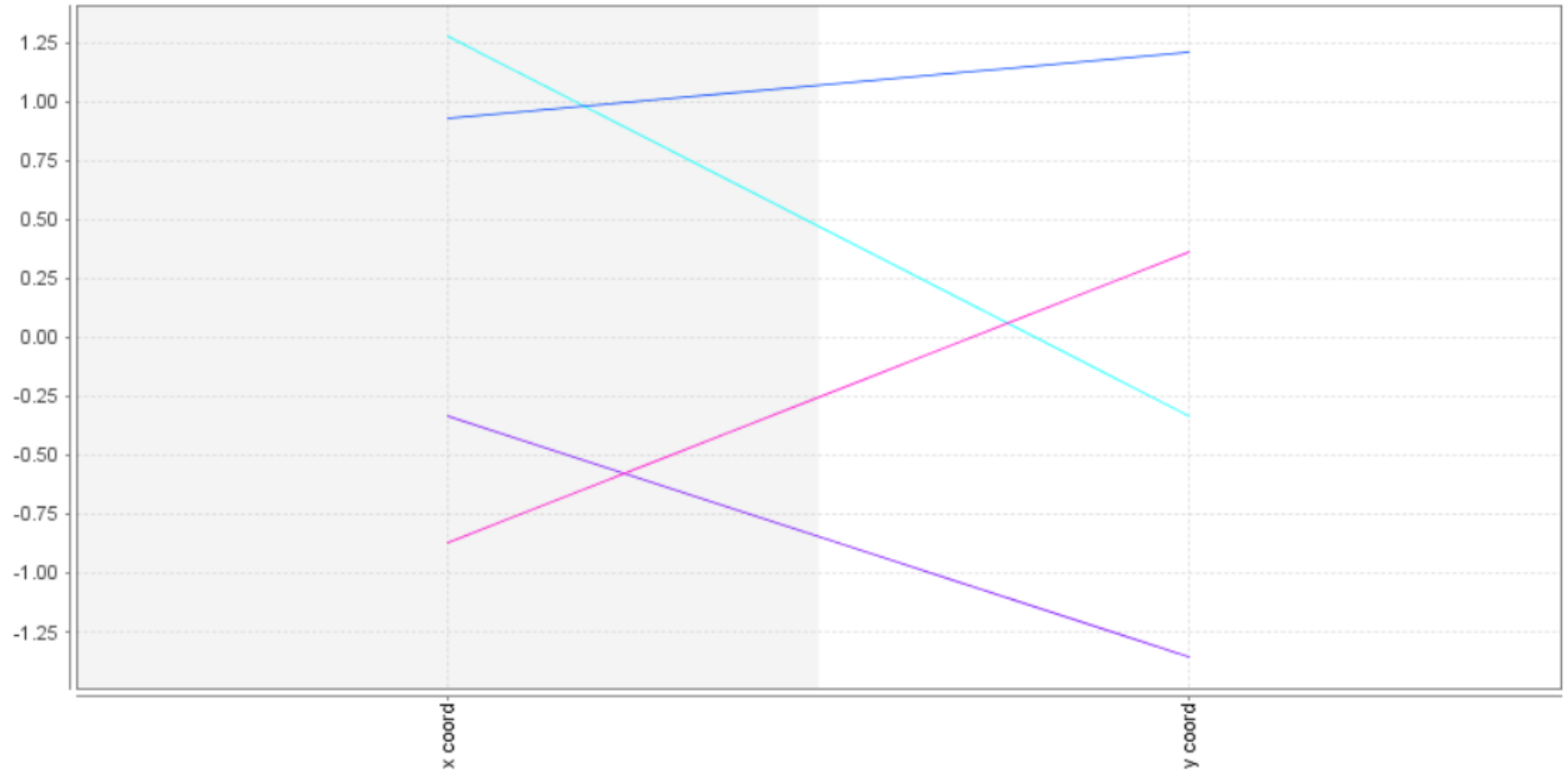
Folder
View

Graph

Centroid
Table

Plot

■ 0 ■ 1 ■ 2 ■ 3



Result History

ExampleSet (Clustering)

PerformanceVector (Performance)

ExampleSet (//Local Repository/data/Presentation-3f/Atrium)


Data



Statistics



Charts


Advanced
Charts


Annotations

Chart style:



x-Axis:

x coord

☐ Log scale

y-Axis:

y coord

☐ Log scale

Color Column:

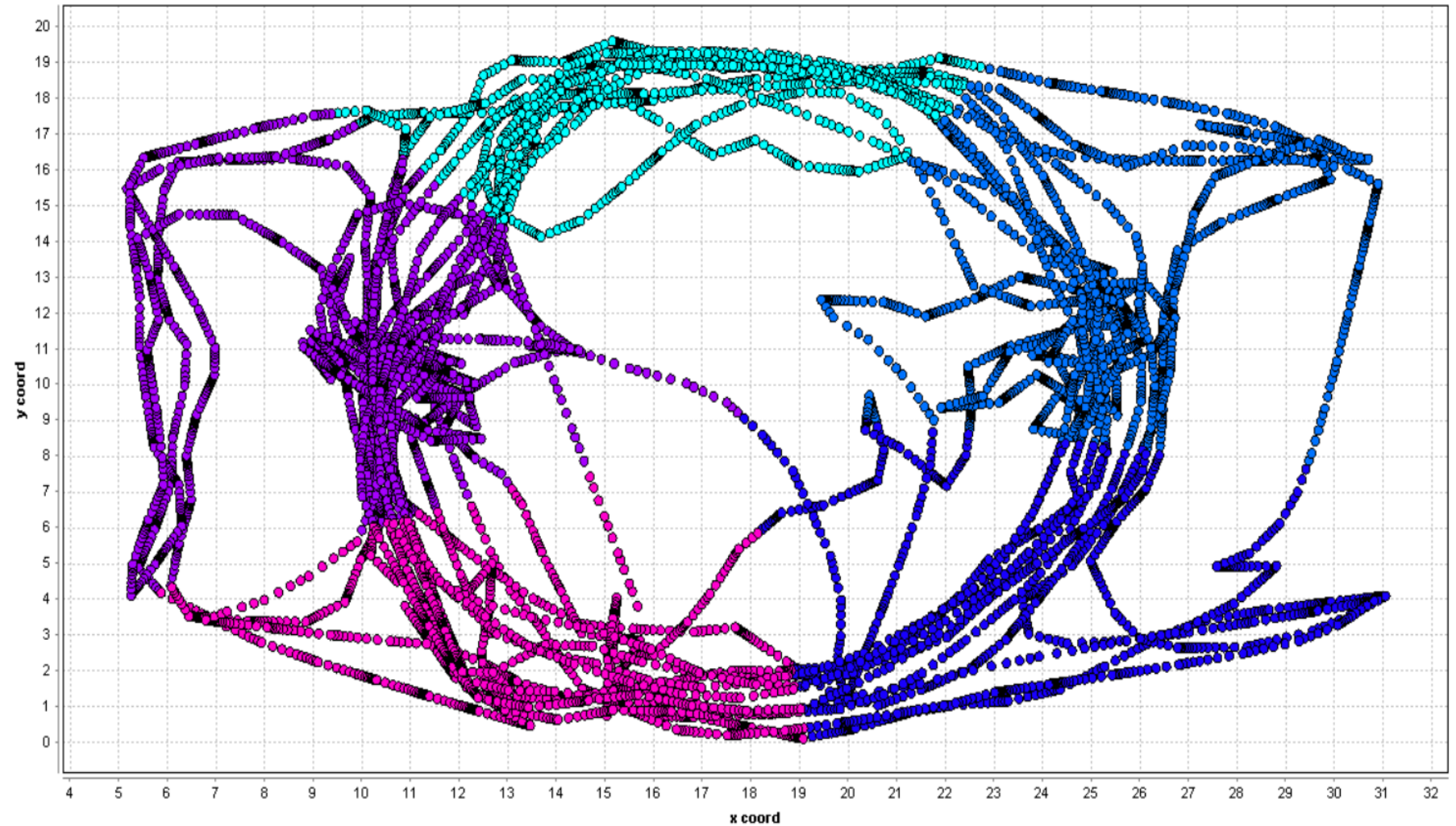
cluster

☐ Log scale

Jitter:


☐ Rotate labels

cluster cluster_3 cluster_0 cluster_4 cluster_1 cluster_2



File Edit Process View **Connections** Cloud Settings Extensions Help



Views:

Design

Results

Turbo Prep

Auto Model

Find data, operators...etc

All Studio

Repository

+ Import Data

Assignments-HouseholdP

Chapter05DataSet (SK

Presentation-3flAtrium

Operators

Search for Operators

Data Access (50)

Blending (77)

Cleansing (25)

Modeling (149)

Scoring (12)

Validation (29)

Utility (86)

Process

Process

100%

Retrieve 3rd floor at...

Normalize

Clustering

Performance

Cluster Model Visua...

Parameters

Process

logver... init

logfile

resultfi...

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[Hide advanced parameters](#)

[Change compatibility \(9.1.000\)](#)

File Edit Process View Connections Cloud Settings Extensions Help

Views: Design Results Turbo Prep Auto Model

Find data, operators...etc

PerformanceVector (Performance) ExampleSet (//Local Repository/data/Presentation-3fAtrium)

Result History ClusterModelVisualizerIOObject (Cluster Model Visualizer)

Overview

Heat Map

Centroid Chart

Centroid Table

Scatter Plot

Number of Clusters: 5
Distance Measure: Squared Euclidean Distance
Average Cluster Distance: 0.287
Davies-Bouldin Index: 0.624

Cluster 0	4,197	Average Distance: 0.232
x coord is on average 57.12% smaller, y coord is on average 14.80% larger		
Cluster 1	1,385	Average Distance: 0.319
y coord is on average 88.08% larger, x coord is on average 1.45% larger		
Cluster 2	1,330	Average Distance: 0.400
x coord is on average 73.17% larger, y coord is on average 58.62% smaller		
Cluster 3	2,409	Average Distance: 0.269
y coord is on average 76.50% smaller, x coord is on average 28.39% smaller		
Cluster 4	2,469	Average Distance: 0.320
x coord is on average 84.56% larger, y coord is on average 31.66% larger		

«

Create Class Discre... Feature Constr... Feature Statist...

Purge Domain Save Data

Visualize

Model

Evaluate

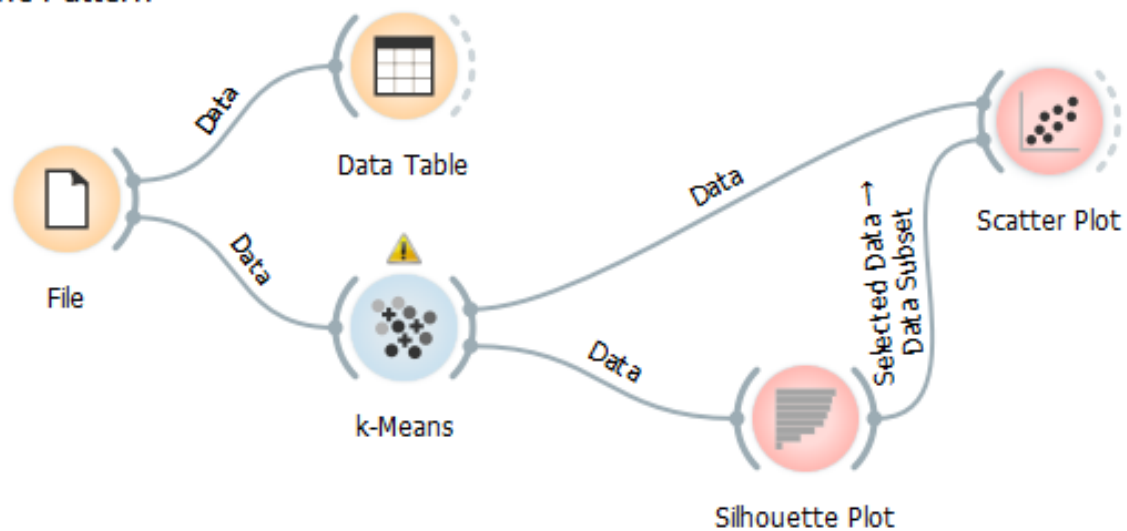
Unsupervised

▼

Select a widget to show its description.

See [workflow examples](#), [YouTube tutorials](#), or open the [welcome screen](#).

3fl Atrium Traffic Pattern



Scatter Plot

Axis x: **N** x coord

Axis y: **N** y coord

Find Informative Projections

Color: **C** Cluster

Shape: (Same shape)

Size: (Same size)

Label: (No labels)

☐ Label only selected points

Symbol size:

Opacity:

Jittering:

☐ Jitter numeric values

☐ Show color regions

☒ Show legend

☐ Show gridlines

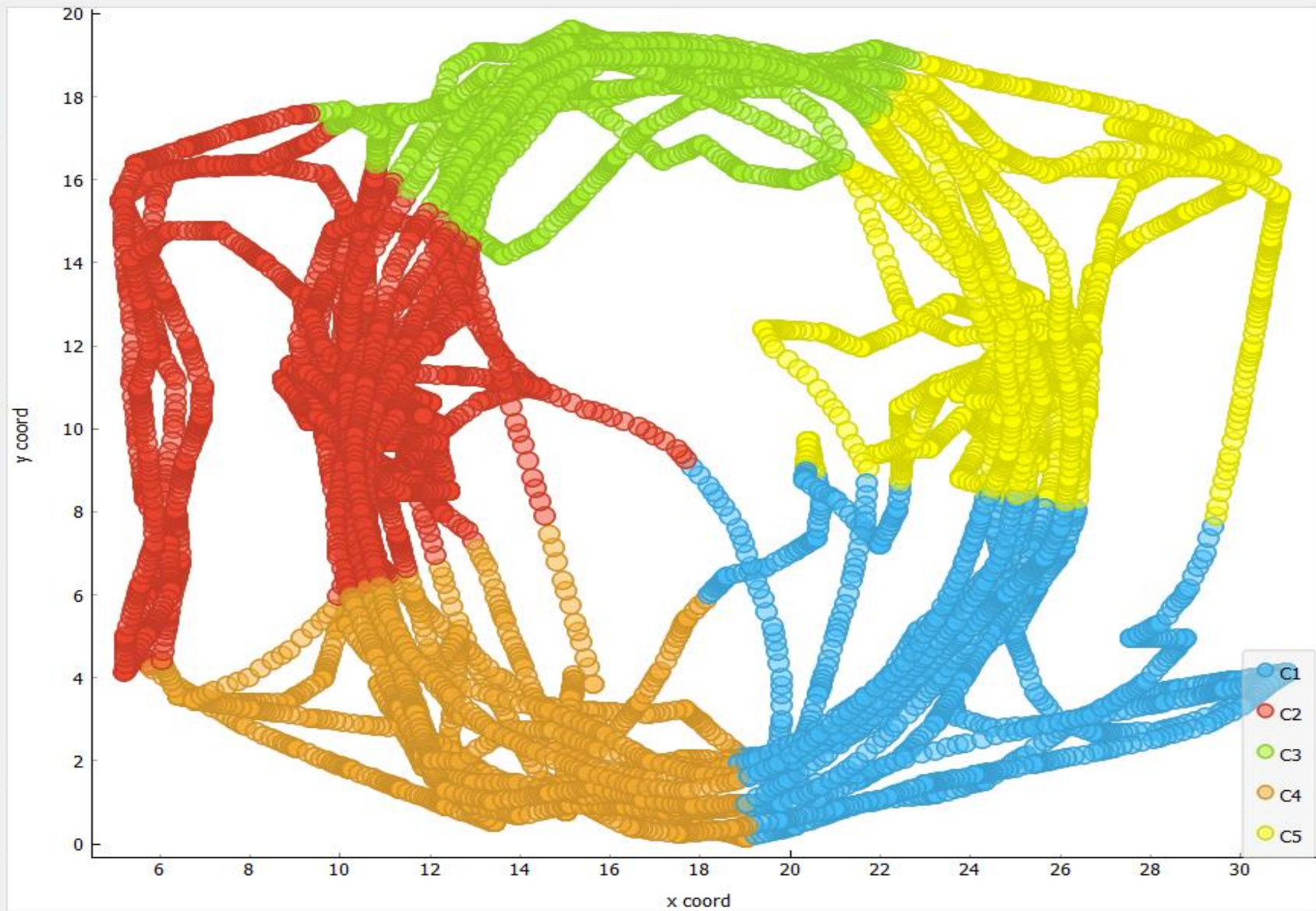
☒ Show all data on mouse hover

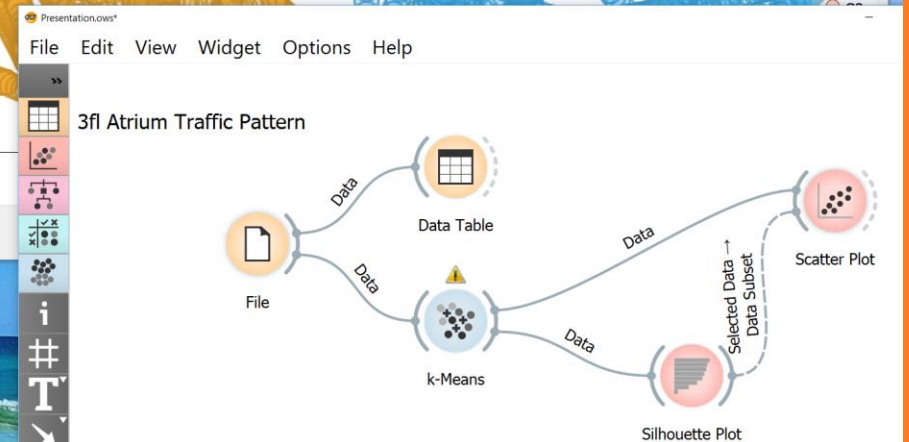
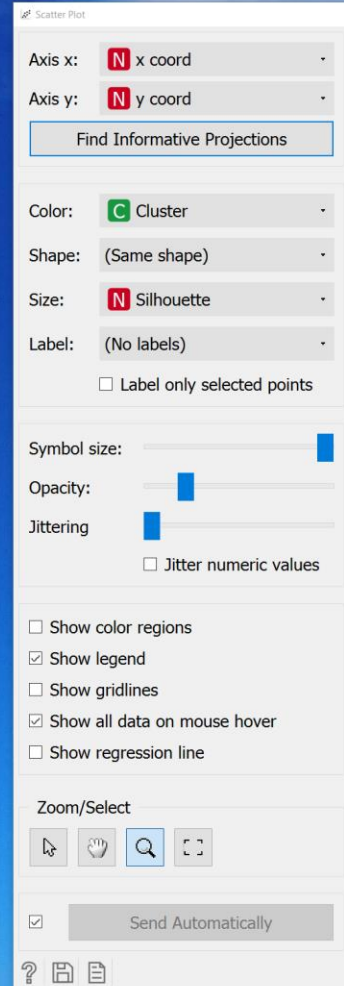
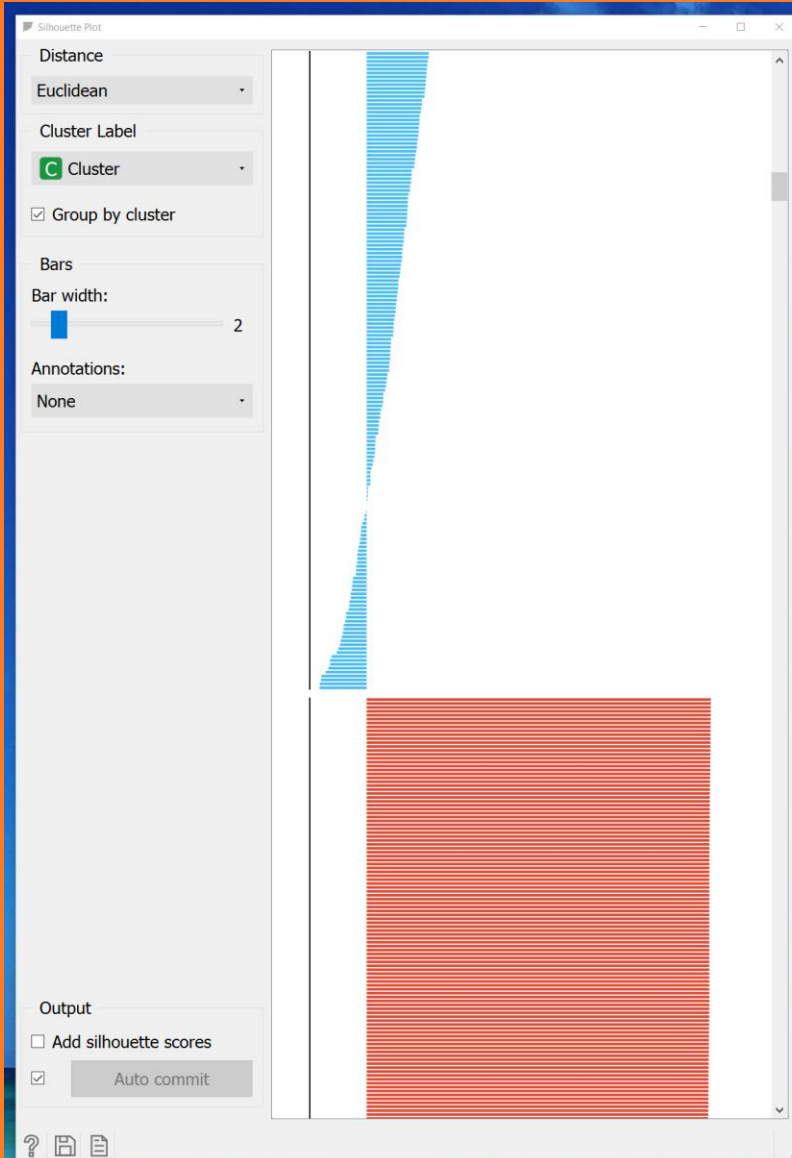
☐ Show regression line

Zoom/Select



☒ Send Automatically





RapidMiner vs. Orange



- **Performance operator**
measures
avr within centroid distance &
Davies Bouldin index
- Lower the index the better*
- No limit on sample size
- Cluster Model Visualizer
operator to see clusters



- **Silhouette scores**
measure
how well on avr each data pt
fits into designated cluster
- Higher the score the better
- Not computed >5000 samples*
- Cluster visualized automatically;
syncs interactively to Silhouette

Comparison Summary

	RapidMiner	Orange
Measures cluster quality	Y	Y
Manually select centroids*	N	Y
Sample size limit for cluster quality*	N	Y
Normalize data*	Y	N
Cluster results visualization	Y	Y

Sample Data Information

KSU Marietta Campus Atrium Bldg 3 FL Traffic Pattern Analysis

- 11790 examples with 2 attributes (x & y coordinates)
- Data captured by beacons every 10 sec for 1 hour
- Goal: Monitor traffic pattern clusters to inform virtual/mixed reality application for indoor navigation assistance for the blind
- Idea was to use beacons to detect heavy/light traffic areas indoors and warn blind users, as change from heavy to light/no traffic could indicate construction or path blockage



Thank You

<https://www.youtube.com/watch?v=I0e0Qyev8Ac> ORANGE TUTORIAL

