



# Article Student Grouping Based on Final Exam Values of the Courses with the K-Means Classification Method Using KNIME

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**Abstract:** In learning, each student must have a different way of education and learning patterns that will impact the results of their learning evaluation at the end of each semester. Furthermore, assessing a student who excels in learning is one of them by looking at the score of the final exam results. Maybe the student can easily get good grades because they have expertise in that field or get good grades because they are diligent in studying. The scores of students final semester exams in several courses will be summarized here to be used as a basis for classifying students into several groups; intelligent, average, and less good students. In this research using AI & K-Means Algorithm

**Keywords:** K-Means, Classification, Machine Learning, Unsupervised Learning, Students Classification, Online Learning

#### 1. Introduction

Student learning activities are carried out during online learning in different places; most of them have returned to their respective hometowns since the beginning of the online learning period. Some of them experience learning difficulties due to inadequate facilities and infrastructure to achieve good learning outcomes.

The object of research is the students of the Information Technology Department in semester 3; the results of the students Final Examination scores in online learning from several courses are collected for clustering using the K-Means method so that they are expected to be able to group students into three categories, i.e., intelligent, average and less good. The results of clustering are expected to be used as evaluation material for study programs to improve strategies in learning or solve problems experienced by students.

With the value data obtained, then grouping will be carried out using the K-Means classification method, previous research has also been conducted to group students but the measuring indicator is the Student Achievement Index (IP) value or Grade Point Average (GPA) [1], Therefore, in this research, a classification will be carried out based on the final score of the five courses that students undergo in full using the online learning system.



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## 2. Literature Review

In this research, a case study was carried out by taking student grade data from the Information Technology Departement Universitas Proklamasi 45; the data was in the form of a .xls file with the contents of the final scores for each course such as Human and Computer Interaction (IMK), Object-Oriented Programming (PBO), Networking (Jarkom), Operations Research (RO), and Advanced Web Programming (Web) as shown in figure 1. All of these courses are compulsory subjects to be taken by students; in the future, the grades of these courses can be used to formulate student interests, as has been done by previous research [2].

Therefore, then what is classification? It is a method for arranging data systematically or according to some predetermined rules or rules. It can also literally be said that classification is the division of something according to classes [3]. Researchers have developed methods to solve classification cases: Decision Tree, Naïve Bayes, Artificial Neural Network, Statistical Analysis, Genetic Algorithm, Rough Sets, k-Nearest Neighbour, Rule-Based Method, Memory Based Reasoning, Support Vector Machine and others [4].

|    | Α  | В           | С         | D                     | E   | F      | G  | Н          |
|----|----|-------------|-----------|-----------------------|-----|--------|----|------------|
| 1  | NO | N.I.M       | NAMA      | NAMA NILAI MATA KULIA |     |        |    |            |
| 2  | NO | IN.I.IVI    | MAHASISWA | IMK                   | PBO | JARKOM | RO | WEB LANJUT |
| 3  | 1  | 19450410001 | FD        | 75                    | 80  | 79     | 80 | 78         |
| 4  | 2  | 19450410002 | MZ        | 70                    | 65  | 65     | 80 | 75         |
| 5  | 3  | 19450410003 | NA        | 85                    | 87  | 79     | 80 | 80         |
| 6  | 4  | 19450410004 | WO        | 75                    | 75  | 85     | 85 | 80         |
| 7  | 5  | 19450410008 | EW        | 85                    | 85  | 80     | 80 | 75         |
| 8  | 6  | 19450410009 | DP        | 80                    | 90  | 85     | 65 | 80         |
| 9  | 7  | 19450410014 | SS        | 75                    | 75  | 65     | 70 | 75         |
| 10 | 8  | 19450410017 | DP        | 80                    | 80  | 76     | 85 | 75         |
| 11 | 9  | 19450410019 | TE        | 75                    | 75  | 75     | 75 | 75         |
| 12 | 10 | 19450410021 | LM        | 65                    | 65  | 65     | 70 | 65         |
| 13 | 11 | 19450410024 | MK        | 80                    | 85  | 85     | 80 | 85         |
| 14 | 12 | 19450410025 | SF        | 85                    | 90  | 85     | 85 | 90         |
| 15 | 13 | 19450410026 | SU        | 85                    | 90  | 85     | 90 | 90         |
| 16 | 14 | 19450410027 | PP        | 75                    | 75  | 70     | 70 | 70         |
| 17 | 15 | 19450410029 | LH        | 75                    | 75  | 70     | 70 | 65         |
| 18 | 16 | 19450410031 | FA        | 0                     | 0   | 0      | 0  | 0          |
| 19 | 17 | 19450410032 | AC        | 78                    | 65  | 75     | 80 | 65         |
| 20 | 18 | 19450410033 | PA        | 80                    | 80  | 75     | 85 | 75         |
| 21 | 19 | 19450410036 | DF        | 78                    | 65  | 70     | 70 | 65         |
| 22 | 20 | 19450410038 | SH        | 75                    | 65  | 70     | 85 | 80         |

Figure 1. Data Shown

## 3. Methods

The K-Means method is one of the methods in Machine Learning which is often called Unsupervised Learning, where data will be grouped without the need for comparisons or data training, K-Means pseudocode, as in figure 2, will be carried out to solve problems from the formation of centroids to forming group groups. or cluster [5], therefore K-Means was chosen because it has proven to be reliable in conducting cluster formation in various cases in various fields such as the classification of measles immunization for children under five per province [6], grouping cities based on human development index in Maluku Province [7], a grouping of outstanding vocational school students [8], a grouping of drug data at Pekanbaru City Hospital [9]. It has also been used to classify students by region of origin to support its marketing strategy [10].

This research will be done using the KNIME application, which has also been done research utilizing this application to classify recommended film and KNIME able to produce good classification results quickly [11]; this research starts from reading the data to be tested in this workflow node one is used, namely Excel Reader, which will function as a data reader that we will test because the file has a .xls format. At first, node one will

be yellow when the data has not been read; it will look like Figure 3. Then we configure node 1 to read the excel file, which we will test, as shown in Figure 4.

| The k-means Clustering Algorithm  |
|---|
| Input : Data points D, Number of clusters k                                 |
| Step 1: Initialize k centroids randomly                                     |
| Step 2: Associate each data point in D with the nearest centroid. This will |
| divide the data points into k clusters.                                     |
| Step 3: Recalculate the position of centroids.                              |
| Repeat steps 2 and 3 until there are no more changes in the membership of   |
| the data points   |
| Output : Data points with cluster memberships                               |

*Figure 2.* K-Means Pseudocode

| ▲ 2: KNIME_SG ▲ *0: SG2 🗙 | Welcome to KNIME Analytics Platform |
|---------------------------|-------------------------------------|
|                           |                                     |
| Excel Reader (XLS)        |                                     |
|                           |                                     |
| Node 1                    |                                     |

# Figure 3. Start Node

| ▲ Dialog - 0:1 - Excel Reader (XLS)<br>File                     | _        | × |
|---|----------|---|
| XLS Reader Settings Flow Variables Memory Policy                |          |   |
| (e) File () Files in folder                                     |          | Î |
| Read from: Local File System V                                  |          |   |
| File: C:Users Jasus ZenBook Downloads Paper SG Rise thilai.xlax | ✓ Browse |   |

Figure 4. Node Configuration

Then after we enter the data, do the execution, and node one will turn green as in figure 5, and for the results of reading the data, it will look like in figure 6.

| 2: KNIME_SG | 🔺 *0: SG2 🕺  | Welcome to KNIME Analytics Platform |
|-------------|--------------|-------------------------------------|
| Excel R     | teader (XLS) |                                     |
|             | xLs          |                                     |
|             | Node 1       |                                     |

Figure 5. Start Node Ready

To use the K-Means Method, we add another node and place it at node 2 for the K-Means Classification Method; after the excel file on node 1 reads well, the results from node one we connect to node two as in Figure 7 and node two will be yellow before configuration and execution.

| Row ID | S Col0 | Col1 | Col2 | Col3 | Col4 | Col5 |
|--------|--------|------|------|------|------|------|
| Row0   | FD     | 75   | 80   | 79   | 80   | 78   |
| Row1   | MZ     | 70   | 65   | 65   | 80   | 75   |
| Row2   | NA     | 85   | 87   | 79   | 80   | 80   |
| Row3   | wo     | 75   | 75   | 85   | 85   | 80   |
| Row4   | EW     | 85   | 85   | 80   | 80   | 75   |
| Row5   | DP     | 80   | 90   | 85   | 65   | 80   |
| Row6   | SS     | 75   | 75   | 65   | 70   | 75   |
| Row7   | DP     | 80   | 80   | 76   | 85   | 75   |
| Row8   | TE     | 75   | 75   | 75   | 75   | 75   |
| Row9   | LM     | 65   | 65   | 65   | 70   | 65   |
| Row10  | MK     | 80   | 85   | 85   | 80   | 85   |
| Row11  | SF     | 85   | 90   | 85   | 85   | 90   |
| Row12  | SU     | 85   | 90   | 85   | 90   | 90   |
| Row13  | PP     | 75   | 75   | 70   | 70   | 70   |
| Row14  | LH     | 75   | 75   | 70   | 70   | 65   |
| Row15  | AC     | 78   | 65   | 75   | 80   | 65   |
| Row 16 | PA     | 80   | 80   | 75   | 85   | 75   |
| Row17  | DF     | 78   | 65   | 70   | 70   | 65   |
| Row 18 | SH     | 75   | 65   | 70   | 85   | 80   |

🛕 Output table - 0:1 - Excel Reader (XLS)

| File Hilite Navigation View |  |
|-----------------------------|--|
|-----------------------------|--|

Figure 6. Shown Table



Figure 7. K-Means

What needs to be paid attention to in the configuration of node 2 for the K-Means method? Please pay attention to the clusters we will form; we set them to 3 collections. The formation of the centroid can be arranged based on the initial row of data or random; here, we put it to select the centroid by random and develop the maximum iteration that will occur.

Set the column where the processing will be carried out because the data we have set for processing is only for data on student course values indicated by the code Col, Col2, Col3, Col4, and Col5. All of these configurations will be as in Figure 8.

Finally, when the configuration is complete, then execute and see the color change in the status of node two will turn green as shown in Figure 7, that means the clustering process is running well, and we can see the results as in Figure 9.

| ▲ Dialog - 0:2 - k-Means<br>File                |    |                 |       | -              |          | × |
|---|----|-----------------|-------|----------------|----------|---|
| K-Means Properties Flow Variables Memory Policy |    |                 |       |                |          |   |
| Clusters  |    |                 |       |                |          |   |
| Number of clusters: 3                           |    |                 |       |                |          |   |
| Centroid initialization:                        |    |                 |       |                |          |   |
| ○ First k rows                                  |    |                 |       |                |          |   |
| 0   |    |                 |       |                |          |   |
| Random initialization Use static random seed    | 0  |                 | New   |                |          |   |
| Number of Iterations                            |    |                 |       |                |          |   |
| Max. number of iterations: 99 🔹                 |    |                 |       |                |          |   |
| Column Selection                                |    |                 |       |                |          | _ |
| r Exclude                                       |    | - Include       |       |                |          |   |
|   |    |                 |       |                |          |   |
| T Filter  |    | <b>T</b> Filter |       |                |          |   |
|   | >  | Col1            |       |                |          |   |
|   |    | 1 Col2          |       |                |          |   |
|   | >> | I Col4          |       |                |          |   |
|   |    | I Col5          |       |                |          |   |
|   | <  |                 |       |                |          |   |
|   | ~~ |                 |       |                |          |   |
|   | ~~ |                 |       |                |          |   |
|   |    |                 | Ahua  | /s include all | columns. |   |
|   |    |                 | - Ama | s include di   | columns  |   |
| Hilte Mapping                                   |    |                 |       |                |          |   |
| Enable Hilite Mapping                           |    |                 |       |                |          |   |
|   |    |                 |       |                |          |   |
|   |    |                 |       |                |          |   |
|   |    |                 |       |                |          |   |
| <u>.</u>  |    |                 |       |                |          |   |
|   | ОК | Apply           | Can   | cel (          | 2        |   |
|   | UK | Арріу           | Car   |                | <b>D</b> |   |

Figure 8. K-Means Configuration

# 4. Result and Discussion

The Labeled Input in figure 9 appeared, showing clusters that will group the students into 3 clusters. Cluster\_0 indicates that if the student is classified as an intelligent student, then Cluster\_1 will offer an average class, and Cluster\_2 shows a poor student cluster. Clustering can result in the division of smart student groups totaling ten students, students with an intermediate category of 3 students, and as many as six students, including less good students.

| ble "C:\Users\ | Asus ZenBook\D | ownloads\PaperS | G\RisetNilai.xlsx | [Sheet1]" - Rows | : 19 Spec - Colu | umns: 7 Propert | ies Flow Varia |
|----------------|----------------|-----------------|-------------------|------------------|------------------|-----------------|----------------|
| Row ID         | S Col0         | I Col1          | I Col2            | I Col3           | I Col4           | I Col5          | S Cluste       |
| Row0           | FD             | 75              | 80                | 79               | 80               | 78              | cluster_0      |
| Row1           | MZ             | 70              | 65                | 65               | 80               | 75              | cluster_1      |
| Row2           | NA             | 85              | 87                | 79               | 80               | 80              | cluster_0      |
| Row3           | WO             | 75              | 75                | 85               | 85               | 80              | cluster_0      |
| Row4           | EW             | 85              | 85                | 80               | 80               | 75              | cluster_0      |
| Row5           | DP             | 80              | 90                | 85               | 65               | 80              | cluster_0      |
| Row6           | SS             | 75              | 75                | 65               | 70               | 75              | cluster_2      |
| Row7           | DP             | 80              | 80                | 76               | 85               | 75              | cluster_0      |
| Row8           | TE             | 75              | 75                | 75               | 75               | 75              | cluster_2      |
| Row9           | LM             | 65              | 65                | 65               | 70               | 65              | cluster_2      |
| Row10          | MK             | 80              | 85                | 85               | 80               | 85              | cluster_0      |
| Row11          | SF             | 85              | 90                | 85               | 85               | 90              | cluster_0      |
| Row12          | SU             | 85              | 90                | 85               | 90               | 90              | cluster_0      |
| Row13          | PP             | 75              | 75                | 70               | 70               | 70              | cluster_2      |
| Row14          | LH             | 75              | 75                | 70               | 70               | 65              | cluster_2      |
| Row15          | AC             | 78              | 65                | 75               | 80               | 65              | cluster_1      |
| Row16          | PA             | 80              | 80                | 75               | 85               | 75              | cluster_0      |
| Row17          | DF             | 78              | 65                | 70               | 70               | 65              | cluster_2      |
| Row18          | SH             | 75              | 65                | 70               | 85               | 80              | cluster_1      |

Figure 9. K-Means Cluster

## 5. Conclusions

With existing data, testing using the KNIME application using the K-Means classification method can produce student classifications based on the final grades obtained. And also, the use of the KNIME application is efficient. Therefore, it is expected to help solve other problems quickly.

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