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Algorithm Implementation C4.5 For Classification Food Menu to Prevent Stunting in Children

Rizki Fadhilah Ramadhani<sup>1</sup>, Bustami<sup>2</sup>, Zahratul Fitri <sup>3</sup>

<sup>1</sup>University of Malikussaleh, Informatics Department, Jln. Batam, Lhokseumawe, 24353, Indonesia, fadhillahrizki0701@gmail.com

<sup>2</sup> University of Malikussaleh, Informatics Department, Jln. Batam, Lhokseumawe, 24353, Indonesia, bustami@unimal.ac.id

<sup>3</sup> University of Malikussaleh, Informatics Department, Jln. Batam, Lhokseumawe, 24353, Indonesia, zahratulfitri@unimal.ac.id

Corresponding Author: fadhillahrizki0701@gmail.com | Phone: +6281263291749

## Abstract

Stunting in childhood is one of the most significant obstacles to human development and globally affects about 162 million children under five. One effort to prevent stunting is a program to increase the nutritional intake of the community, especially children under five, by providing supplementary food (PMT). Classification is one of the data processing techniques that can be used in this process. The results obtained from the study show that the designed system can input training data and data for classification so that the health centre and guardians can determine the good and bad food menus according to the existing data of toddlers. Based on the results of testing with training data and testing data with a ratio of 80:20 from a dataset of 200 data, namely 160 training data, and 40 test data using the C4.5 algorithm obtained in dataset 1 obtained an accuracy value of 82,5%, precision value of 0.96, recall value of 0,8 and F1-score of 0,87273, then in dataset 2 obtained an accuracy value of 72,5%, precision value 0,75, recall value 0,84 and F1-score value 0,79245.

Keywords: Data Mining, Classification, Algorithm C4.5, Stunting, Food Menu

# INTRODUCTION

Stunting is a condition where a child is too short for his age because he experiences growth failure caused by poor nutrition and health before and after birth (UNICEF, 2024). Stunting is defined as short or very short based on length/height for an age of less than -2 standard deviations (SD) on the WHO growth curve, which occurs due to irreversible conditions due to inadequate nutritional intake and recurrent/chronic infections that occur within 1000 HPK (Ministry of Health Directorate General of Health Services, 2023).

Aceh is the province with the fifth highest prevalence of stunting in toddlers in Indonesia in 2022 based on data from the 2022 National Nutrition Status Survey (SSGI), the prevalence of stunting in Indonesia is 21.6%. This number has decreased compared to the previous year, which was 24.4%. Although decreasing, this figure is still high, considering the target prevalence of stunting in 2024 according to the WHO standard is below 20% (Ministry of Health Directorate General of Health Services, 2023) Providing an appropriate and nutritious food menu for children is very important in this context. However, providing a food menu that suits each child's needs is difficult. There are many factors to consider, such as age, weight, height, and nutritional status child.

Data analysis is required to determine the right food menu. The menu should be based on the nutritional needs of children who are vulnerable to stunting. One data processing technique that can be used in this process is classification.

Classification is a process that aims to find patterns from relatively large to extensive data. AlgorithmC4.5 is a predictive algorithm commonly used to classify segment or group data. At the same time, decision trees (*Decision Trees*) are a classical method function that transforms significant facts into decision trees representing rules (Rahmadhani & Wulan, 2020).

Using a data-driven approach and algorithms*C*4.5, recruitment classification results in the food menu will be based on learning from previously existing food menu data. This study aims to use algorithm*C*4.5 to classify stunting status and food menus for stunted children. This algorithm produces rules that can determine the feasibility of a food menu to prevent stunting. The results of this study are in the form of the development of a web-based information system that can classify food menus for stunted children. With this system, parents and related parties are expected to be

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able to easily access relevant and practical information to ensure that children get adequate nutritional intake. This is expected to contribute to efforts to prevent stunting in children in Indonesia and other countries facing similar problems.

## LITERATURE REVIEW

## **Data Mining**

Data Mining is a process that uses statistical, mathematical, artificial intelligence, and machine learning techniques to extract and identify useful information and related knowledge from large databases. It is also known by other names: knowledge discovery (mining) in databases (KDD), knowledge extraction, data/pattern analysis, and business intelligence (Windarto et al., 2019).

#### Classification

Classification performs an analysis of the training data to form classification rules, commonly referred to as the learning or training process. Subsequently, classification will analyze the testing data to evaluate the classification rules obtained from the training process (Darnila et al., 2021).

Classification is a set of records that represent characteristic values in the form of a collection of attributes or specific attributes known as class labels. Classification is tasked with learning the target by mapping each attribute to one of the predefined classes (Asrianda et al., 2023).

## C4.5 Algorithm

The C4.5 algorithm is an algorithm used to form a decision tree. Decision trees are the most advanced and wellknown classification and prediction method. Decision trees help find hidden relationships between several candidate input variables and a target variable. The decision tree method transforms massive facts into decision trees that represent rules. The rules can be easily understood in natural language. It can also be expressed as a database to find records in specific categories (Wijaksana et al., 2022).

According to (Ardiansyah & Walim, 2018), there are several stages in creating a decision tree in the C4.5 algorithm, namely:

1. Preparing training data. Training data is usually taken from historical data that has occurred before and has been grouped into specific classes.

2. Calculating the root of the tree. The root will be taken from the attribute to be selected by calculating the gain value of each attribute; the highest gain value will be the first root. Before calculating the gain value of the attribute, first calculate the entropy value.

To calculate the entropy value, the formula is used:

$$Entropy(S) = \sum_{i=1}^{n} -pi * Log_2 pi$$
(1)

Note:

- S = case set
- n = number of partitions S
- pi = the proportion of Si to S

Then, after the entropy value for each attribute has been obtained, calculate the gain value using the formula:

 $Gain(S, A) = Entropy(S) - \sum_{i=1}^{n} \frac{|Si|}{|S|} * Entropy(Si)$ 

(2)

Note:

- S = case set
- A = feature
- n = number of partition attributes A

|Si| = the proportion attributes A

|S| = number of cases in S

## Stunting

ACCORDING TO WHO (2020), STUNTING IS DEFINED AS BEING SHORT OR VERY SHORT FOR AGE, WITH HEIGHT/LENGTH FOR AGE LESS THAN -2 STANDARD DEVIATIONS (SD) ON THE WHO GROWTH CURVE. IT OCCURS AS A RESULT OF IRREVERSIBLE CONDITIONS CAUSED BY INADEQUATE NUTRITION OR REPEATED/CHRONIC INFECTIONS THAT OCCUR DURING THE FIRST 1,000 DAYS OF LIFE (KEMENTERIAN KESEHATAN DIREKTORAT JENDERAL PELAYANAN KESEHATAN, 2022).

The causes of stunting include factors such as nutritional intake and health status, which encompass food security (availability, affordability, and access to nutritious food), social environment (norms, infant and child feeding practices, hygiene, education, and workplace conditions), health environment (access to and provision of preventive and curative services), and living conditions (water, sanitation, and building conditions).

## **Stunting Children's Food Menu**

The strategies for implementing programs to address stunting include improving caregiving practices, such as Early Initiation of Breastfeeding (IMD), Early Breastfeeding (IMD), exclusive breastfeeding for the first 6 months, and continuing breastfeeding alongside complementary foods (MP-ASI) until the age of 2 years. Stunting prevention in young children can be addressed by providing age-appropriate nutrition, including both macronutrients (energy, carbohydrates, protein, and fats) and micronutrients (vitamins and minerals). Ensure a balanced diet by following the recommended intake of staple foods (3-4 servings per day), vegetables (3-4 servings), fruits (2-3 servings), and animal or plant-based protein sources (2-4 servings per day), along with increased water consumption. Additionally, it is important to limit the intake of sugar, salt, and oil (Kementerian Kesehatan Direktorat Jenderal Pelayanan Kesehatan, 2022).

## **MATERIALS & METHODS**

The data used in this research is the Monitoring and Evaluation Data of Local Food Supplementation for Toddlers Phase. I obtained from Muara Satu Community Health Center. This data is presented in .xlsx format and consists of 200 data entries.

Table 1. Dataset 1									
No	Name	Age	W/A	H/A	W/H				
1	Ullfa Zaahirah	Phase 1	Underweight	Stunted	Malnutrition				
2	M Kaivan A	Phase 2	Underweight	Normal	Malnutrition				
3	Afifah Khairulnnisa	Phase 2	Underweight	Normal	Malnutrition				
4									
200	M.Ilham	Phase 4	Normal	Normal	Good Nutrition				
		Table 2	. Dataset 2						
No	Age	W/H	Food Menu Code	De	scription				
1	Phase 1	Malnutrition	M2	N	ot Good				
2	Phase 2	Malnutrition	M3	Not Good					
3	Phase 2	Malnutrition	M4	Not Good					
4									
200	Phase 4	Good Nutrition	M3		Good				

The research method generally explains the stages that will be carried out in this research to get the desired results and solve the problem briefly. The following are the stages of research:

1. Literature Study

In the crucial data collection phase, literature studies are drawn from a variety of sources, including journals, papers, and books, in both digital and hardcopy formats.

2. Requirement Analysis

Requirement analysis is a comprehensive process that involves understanding the actual needs of the system to be developed and creating a system that precisely meets those needs.

3. System Design

System design is a collection of activities that meticulously describe how the system will function in detail.

4. System Implementation

In this phase, the design created in the previous phase is implemented using the chosen programming language. 5. System Testing

This phase involves testing the system that was implemented in the previous stage.

6. Evaluation

This phase involves evaluating the results of the system testing. The evaluation assesses the extent to which the research objectives have been achieved.

# Algorithm Schematic

The following is the algorithm schematic for this research:

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System Schematics



## Explanation

- 1. Start
- 2. Import dataset: The user uploads a dataset in .csv or .xlsx format.
- 3. The uploaded data is then displayed.
- 4. Next, the data is split into training and testing datasets.
- 5. Perform the mining process to generate the decision tree.
- 6. After obtaining the decision tree, the system will classify the dataset using the C4.5 algorithm based on the constructed decision tree.
- 7. The system will display the results: accuracy, precision, recall, F1-score, classification results, rules, and the confusion matrix to measure the performance of the resulting classification system.
- 8. Done.

## **RESULTS AND DISCUSSION**

Below are the nutritional status tables for toddlers, the age table, and the food menu table.

1. Toddler Status Table

	Table 3. Classes and Labels					
No	Class	Labels				
1	W/A	Very Underweight, Underweight, Normal				
		Weight				
2	H/A	Very Short, Short, Normal				
3	W/H	Good Nutrition, Malnutrition				

#### 2. Age Table

The age table below shows age groups according to WHO food supplementation guidelines.

Ladie 4. Age Lable						
Code	Age (Months)					
Phase 1	0-5					
Phase 2	6-11					
Phase 3	12-47					
Phase 4	48-72					

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#### 3. Food Menu Table

The food menu table below is a table of food menus obtained from Muara Satu Community Health Center

	Table 5. Food Menu Table		
No	Food Menu Combination	Food Menu Code	Food Menu Category
1	Breast milk	M1	-
2	Vegetable omelet, whole grain bread, fruit salad + banana + grilled chicken rice, broccoli soup, fruit jelly + yogurt with fruit pieces + beef stew, potatoes, and carrots + apple slices Oatmeal with fruit and nuts + fruit yogurt + white rice, grilled		
3	chicken, and mixed vegetables + fruit and vegetable smoothie + peanut butter and vegetable sandwich + apple slices White rice with mixed vegetables, grilled chicken + vegetable		
4	smoothie with yogurt + white rice with vegetable soup and beef + vegetable smoothie + grilled chicken with mashed potatoes and mixed vegetables + fruit smoothie	M2	Light food
5	White rice with mixed vegetables + papaya + rice with meatball soup + mixed vegetables + rice with chicken meatballs + melon		
6	Green bean and banana smoothie + mixed vegetables and carrots + white rice with vegetable soup and spinach + chicken banana + boiled cassava with green beans and omelet		
7	Chicken soup + fruit slices + fried rice with spinach + whole grain bread + peanut butter and vegetable sandwich + fruit slices		
8	Mixed vegetables and whole grain bread + banana + rice with omelet and shrimp + green bean smoothie + fried rice with chicken and soup + papaya and salad		
9	Mixed vegetables and whole grain bread + papaya and avocado + rice with meatball soup + boiled cassava + rice with chicken meatballs and greens + fruit salad	M3	Medium Food
10	Papaya and whole grain bread + banana + grilled rice with fish + mixed vegetables and cassava + rice with chicken and soup + fried potatoes		
11	Chicken rice with boiled potatoes and carrots + papaya + fried rice with spinach + whole grain bread + rice with fish noodle soup + papaya and salad		Неаууу
12	Mixed vegetables and whole grain bread + papaya and avocado + rice with meatball soup + boiled cassava and papaya + rice with chicken meatballs and greens + fruit salad and salad	M4	Food

## Manual Calculation of the C4.5 Algorithm

The table below contains a dataset from Muara Satu Community Health Center for 2023/2024. The dataset is divided into two parts, 80:20, where 80% is for training data and 20% is for testing data. The following are the steps for manually constructing the decision tree:

1. **Preparing the Dataset** 

Table 6. Dataset 1								
No	Name	Age	W/A	H/A	W/H			
1	Ullfa Zaahirah	Phase 1	Underweight	Stunted	Malnutrition			
2	M Kaivan A	Phase 2	Underweight	Normal	Malnutrition			
3	Afifah Khairulnnisa	Phase 2	Underweight	Normal	Malnutrition			
4								
					Good			
200	M.Ilham	Phase 4	Normal	Normal	Nutrition			
		Table 7.	Dataset 2					
No	Δσο	W/H	Food Menu	Doce	ription			
110	Age	VV/11	Code	Description				
1	Phase 1	Malnutrition	M2	Not	Good			
2	Phase 2	Malnutrition	M3	Not	Good			

3	Phase 2	Malnutrition	M4	Not Good
4		••••		
200	Phase 4	Good Nutrition	M3	Good

Splitting the Dataset Into Training Data and Testing Data. The next step is to separate the dataset into training and testing data. The comparison for splitting the dataset is 80% training and 20% testing data. The training data can be found in Table 7 below:

		Table	8. Training Data 1						
No	Name	Age	W/A	H/A	W/H				
1	Ullfa Zaahirah	Phase 1	Underweight	Stunted	Malnutrition				
2	M Kaivan A	Phase 2	Underweight	Normal	Malnutrition				
3	Afifah Khairulnnisa	Phase 2	Underweight	Normal	Malnutrition				
4									
160	Mikhayla Jasmine	Phasel 4	Normal	Normal	Good Nutrition				
		Table	9. Training Data 2						
No	o Age	W/H	Food Menu Code	Desc	ription				
1	Phase 1	Malnutrition	M2	Not	Good				
2	Phase 2	Malnutrition	M3	Not	Good				
3	Phase 2	Malnutrition	M4	Not	Good				
4									
160	) Phase 4	Good Nutrition	M3	Not	Good				
Next, t	Next, the testing data can be seen in Tables 8 and 9 below:								
		Table	10. Testing Data 1						
No	Name	Age	W/A	H/A	W/H				
1	Muhammad Habib	Phase 4			Good				
1	Zayyan	Thase 4	Normal	Normal	Nutrition				
2		Phase 1			Good				
2	Adam Nur Wahid	1 11050 4	Normal	Normal	Nutrition				
3	AISYAH APRINIA	Phase 3			Good				
5	ASZAHRA	1 Huse 5	Normal	Normal	Nutrition				
4		••••							
40		Phase 4			Good				
10	M.Ilham	110001	Normal	Normal	Nutrition				
		Table	<b>11</b> . Testing Data 2						
No	Age	W/H	Food Menu	Descr	iption				
			Code		-F				
1	Phase 1	Good Nutrition	M1	Go	od				
2	Phase 4	Good Nutrition	M4	Go	od				
3	Phase 4	Good Nutrition	M2	Not (	Good				
4					_				
40	Phase 4	Good Nutrition	M3	Go	od				
Calculate	Entropy, Information	Gain and Gain R	latio						

A. Data 1

3.

Table 12. Results of the Entropy Calculation for Data 1

NODE		Description	Amount	Good Nutrition	Malnutrition	elntropy	Gain
0	Total		160	70	90	0,9886994	
							0,94144
		Underweight	70	1	69	0,1080232	
	W/A	Very Underweight	21	0	21	0	
		Normal weight	69	69	0	0	
							0,24675
		Short	34	1	33	0,1914333	
	H/A	Normal	111	68	43	0,9630928	
		Very Short	15	1	14	0,3533593	

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		Phase 1	1	0	1	0	0,59138
	1 30	Phase 2	4	0	4	0	
	Age	Phase 3	82	5	77	0,3313056	
		Phase 4	73	65	8	0,4986751	

# Table 13. Results of the Calculation Node Level 1.2 for Data 1

NODE 1		Description	Amount	Good Nutrition	Malnutrition	elntropy	Gain
1.2	Amount		70	1	69	0,108023195	
	W/A	Underweight	70	1	69	0,108023195	0
							0,079451767
	LI / A	Short	25	0	25	0	
	п/ А	Normal	43	0	43	0	
		Very Short	2	1	1	1	
							0,045901545
		Phase 1	1	0	1	0	
	Age	Phase 2	3	0	3	0	
		Phase 3	58	0	58	0	
		Phase 4	8	1	7	0,543564443	
	T	able 14. Results o	f the Calcu	lation Node	Level 1.2.3 for	Data 1	
NODE 1		Description	Amount	Good Nutrition	Malnutrition	elntropy	Gain
1.2.3	Amount		4	1	1	1	
	W/A	Underweight	2	1	1	1	0,5
	H/A	Very Stunted	2	1	1	1	0,5
							1
		Phase 1	0	0	0	0	
	Age	Phase 2	0	0	0	0	
		Phase 3	1	0	1	0	
		Phase 4	1	1	0	0	



Figure 3 Decesion Tree Node Level 1 Data 1

B.	Data	2
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**Table 15**. Results of the Entropy Calculation for Data 2

					1 2		
NODE 1		Description	Amount	Good Nutrition	Malnutrition	elntropy	Gain
1	Amount		160	60	100	0,954434	
							0,0002746
	W/H	Good Nutrition	70	27	43	0,961978	

		Malnutrition	90	33	57	0.948078	
		manathion		00	0,	0,710070	0.0122115
		Phase 1	6	2	4	0 918296	0,0122110
	Ago	Phase 2	8	1	7	0,543564	
	nge	Dhase 2	70	21	10	0,046224	
		Phase 3	79	31	40	0,966334	
		Phase 4	67	26	41	0,963536	0.4.64 = 0.4.0
	- 1	1.02		4	21	0.000/00	0,1615318
	Food	M2	32	1	31	0,200622	
	Menu	M3	58	31	27	0,996566	
	Code	M4	54	26	28	0,99901	
		M1	16	2	14	0,543564	
Table 16. Results of the Entropy Calculation Node Level 1.2 for Data 2						ata 2	
NODE 1		Description	Amount	Good Nutrition	Malnutrition	elntropy	Gain
1.1	Amount		32	1	31	0.200622	
-	Food		52	1	51	0,200022	
	Menu	M2					
	Code	1012	32	1	31	0 200622	0
	Coue		52	Ŧ	51	0,200022	0
							0,031977291
	W/H	Good	1.		1.		
	,	Nutrition	16	0	16	0	ļ
		Malnutrition	16	1	15	0,33729	
		Phase 1	1	0	1	0	0,200622324
	Age	Phase 2	1	1	0	0	
		Phase 3	14	0	14	0	
-		Phase 4	16	0	16	0	
		Table 17. Re	esults of the	Entropy Ca	lculation Node	Level 1.3 for D	ata 2
NODE				Good			
1		Description	Amount	Nutrition	Malnutrition	elntropy	Gain
1.2	Amount		58	31	27	0 996566	
	Food		00	01		0,7700000	
	Menu	M3					
	Code	IVIS	58	31	27	0 996566	0
	coue		00	51	27	0,770000	0 409(99091
		Carl					0,420000001
	W/H	Good		-	01	0.40(000	
		Nutrition	23	2	21	0,426229	
		Malnutrition	35	29	6	0,660962	
		Phase 1	2	0	2	0	0,996566371
	Age	Phase 2	3	0	3	0	
		Phase 3	31	31	0	0	
		Phase 4	22	0	22	0	
	Table 18. Results of the Entropy Calculation Node Level 1.4 for Data 2						
NODE		<b>Table 18</b> . Re	esults of the	Entropy Ca	lculation Node	Level 1.4 for D	ata 2
1		Table 18. Re     Description	esults of the Amount	Entropy Ca Good Nutrition	lculation Node Malnutrition	Level 1.4 for D elntropy	Gain
1.3	Amount	Table 18. Re Description	Amount	Entropy Ca Good Nutrition 26	lculation Node Malnutrition 28	Level 1.4 for D elntropy	Gain
1.3	Amount	Table 18. Re	esults of the Amount 54	Entropy Ca Good Nutrition 26	lculation Node Malnutrition 28	Level 1.4 for D elntropy 0,99901	ata 2 Gain
1.3	Amount Food	Table 18. Ro	esults of the Amount 54	Entropy Ca Good Nutrition 26	lculation Node Malnutrition 28	Level 1.4 for D elntropy 0,99901	Gain
1.3	Amount Food Menu	Table 18. Re Description M4	Amount	Entropy Ca Good Nutrition 26	lculation Node Malnutrition 28	Level 1.4 for D elntropy 0,99901	Gain
1.3	Amount Food Menu Code	Table 18. Re Description M4	Amount 54 54	Entropy Ca Good Nutrition 26 26	lculation Node Malnutrition 28 28	Level 1.4 for D elntropy 0,99901 0,99901	Gain
1.3	Amount Food Menu Code	Table 18. Re Description M4	Amount 54 54	Entropy Ca Good Nutrition 26 26	lculation Node Malnutrition 28 28	Level 1.4 for D elntropy 0,99901 0,99901	ata 2 Gain 0 0,618142904
1 1.3	Amount Food Menu Code W/H	Table 18. Re Description M4 Good	Amount 54 54	Entropy Ca Good Nutrition 26 26	lculation Node Malnutrition 28 28	Level 1.4 for D elntropy 0,99901 0,99901	ata 2 Gain 0 0,618142904
1.3	Amount Food Menu Code W/H	Table 18. Ro Description M4 Good Nutrition	Amount 54 54 26	Entropy Ca Good Nutrition 26 26 26 24	lculation Node Malnutrition 28 28 28 28	Level 1.4 for D elntropy 0,99901 0,99901 0,391244	ata 2 Gain 0 0,618142904
1.3	Amount Food Menu Code W/H	Table 18. Ro         Description         M4         Good         Nutrition         Malnutrition	Amount 54 54 26 28	Entropy Ca Good Nutrition 26 26 26 24 2	lculation Node Malnutrition 28 28 28 28 28 28 28 26	Level 1.4 for D elntropy 0,99901 0,99901 0,391244 0,371232	ata 2 Gain 0 0,618142904
	Amount Food Menu Code W/H	Table 18. Ro         Description         M4         Good         Nutrition         Malnutrition	Amount 54 54 26 28	Entropy Ca Good Nutrition 26 26 26 24 2	lculation Node Malnutrition 28 28 28 28 28 28 28	Level 1.4 for D elntropy 0,99901 0,99901 0,391244 0,371232	ata 2 Gain 0 0,618142904
	Amount Food Menu Code W/H	Table 18. Re         Description         M4         Good         Nutrition         Malnutrition         Phase 1	Amount 54 54 26 28 1	Entropy Ca Good Nutrition 26 26 26 24 2 2 2 0	lculation Node Malnutrition 28 28 28 28 28 28 20 26 1	Level 1.4 for D elntropy 0,99901 0,99901 0,391244 0,371232 0	ata 2 Gain 0 0,618142904 0,999010271
	Amount Food Menu Code W/H	Table 18. Ro Description M4 Good Nutrition Malnutrition Phase 1 Phase 2	26 28 1 2	Entropy Ca Good Nutrition 26 26 26 24 2 2 2 0 0 0	lculation Node Malnutrition 28 28 28 28 20 26 1 2 2 6	Level 1.4 for D elntropy 0,99901 0,99901 0,391244 0,371232 0 0	ata 2 Gain 0 0,618142904 0,999010271
	Amount Food Menu Code W/H	Table 18. Ro Description M4 Good Nutrition Malnutrition Phase 1 Phase 2 Phase 3	26 28 1 25	Entropy Ca Good Nutrition 26 26 26 24 2 2 0 0 0 0 0	lculation Node Malnutrition 28 28 28 28 20 26 1 2 26 1 2 25	Level 1.4 for D elntropy 0,99901 0,99901 0,391244 0,371232 0 0 0 0	ata 2 Gain 0 0,618142904 0,999010271
	Amount Food Menu Code W/H	Table 18. Ro Description M4 Good Nutrition Malnutrition Phase 1 Phase 2 Phase 3 Phase 4	26 28 1 25 26 28	Entropy Ca Good Nutrition 26 26 24 2 2 0 0 0 0 0 0 26	lculation Node Malnutrition 28 28 28 20 26 1 2 26 1 2 25 0	Level 1.4 for D elntropy 0,99901 0,99901 0,391244 0,371232 0 0 0 0 0 0	ata 2 Gain 0 0,618142904 0,999010271

 Phase 4
 26
 0
 0

 Table 19. Results of the Entropy Calculation for Node Level 1.1 Data 2

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NODE 1		Description	Amount	Good Nutrition	Malnutrition	elntropy	Gain
1.4	Amount		16	2	14	0,543564	
	Food	) <i>(</i> 1	16	2	14	0 5 4 2 5 4 4	
	Menu	MI	16	2	14	0,543564	0
	Code						
							0,015807735
	W/H	Good	5	1	4	0 721928	
	,	Nutrition		-	1	0,7 21720	
		Malnutrition	11	1	10	0,439497	
							0,543564443
		Phase 1	2	2	0	0	
	Age	Phase 2	2	0	2	0	
		Phase 3	9	0	9	0	
		Phase 4	3	0	3	0	



Figure 4. Decision Tree Node Level 0 Data 2

		Table 20. Results of Classification Prediction for Data 1					
No	Name	Age	W/A	H/A	W/H	Prediciion	
	Muhammad						
1	Habib	Phase 4			Good	Good	
	Zayyan		Normal	Normal	Nutrition	Nutrition	
2	Adam Nur	Phase 1			Good	Good	
2	Wahid	1 11050 4	Normal	Normal	Nutrition	Nutrition	
	AISYAH						
3	APRINIA	Phase 3			Good	Good	
	ASZAHRA		Normal	Normal	Nutrition	Nutrition	
4		••••					
40		Phase 4			Good	Good	
10	M.Ilham		Normal	Normal	Nutrition	Nutrition	
	Table 21. Results of Classification Prediction for Data 2						
No	Age		N/H	Food Menu	Description	Prediction	
				Code	Description		
1	Phase 1	Good	Nutrition	M1	Good	Good	
2	Phase 4	Good	Nutrition	M4	Good	Good	
3	Phase 4	Good	Nutrition	M2	Not Good	Good	
4							
40	Phase 4	Good	Nutrition	M3	Good	Not Good	
	Table 22. Confusion Matrix Data Testing 1						
	Actual						
			Good Nutrition		Malnutritio	n	

Good Nutrition	24	6					
Malnutrition	1	9					
Table 23. Confusion Matrix Data Testing 2							
Actual	Prediction						
netual	Good	Not Good					
Good	21	4					
Not Good	7	8					

4. Calculate Accuracy, Precision, Recall, and F1-Score

A. Accuracy Data Testing 1

 $A c c u r a c y = \frac{(24+9)}{(24+9+1+6)} \times 100\% = 82,5\%$ 

B. Accuracy Data Testing 2

 $A c c u r a c y = \frac{(21+8)}{(21+8+7+4)} \times 100\% = 72,5\%$ 

C. Precision Data Testing 1

cision 
$$=\frac{(24)}{(24+1)} \times 100\% = 0.96$$

D. Precision Data Testing 2

Precision 
$$= \frac{(21)}{(21+7)} \times 100\% = 0.75$$
  
Recall Data Testing 1  
Recall  $= \frac{(24)}{(24+6)} \times 100\% = 0.8$ 

Pred

- F. Recall Data Testing 2 Recall  $=\frac{(21)}{(21+4)} \times 100\% = 0.84$
- G. F1-score Data Testing 1 F1-score =2 ×  $\frac{0.96 \times 0.8}{0.96 + 0.8}$  = 0.87273
- H. F1-score Data Testing 2

F1-score =2 
$$\times \frac{0.75 \times 0.84}{0.75 + 0.84} = 0.79245$$

# CONCLUSIONS

E.

- 1. The C4.5 classification algorithm can classify the nutritional status of toddlers and food menus effectively.
- 2. This study utilized a dataset consisting of 200 data points.
- 3. In this research, training and testing data were used with a ratio of 80:20 from the dataset of 200 data points, with 160 data points for training and 40 data points for testing.
- 4. The C4.5 algorithm has proven to be effective in classifying food menus for stunted children, yielding a reasonably good performance. In dataset 1, the accuracy was 82,5%, precision value of 0.96, recall value of 0,8 and F1-score of 0,87273, then in dataset 2 obtained an accuracy value of 72,5%, precision value 0,75, recall value 0,84 and F1-score value 0,79245.

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