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# **RESEARCH ARTICLE**

# Improving LZW Compression of Unicode Arabic Text Using Multi-Level Encoding and a Variable-Length Phrase Code

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**ABSTRACT** This paper introduces a novel approach to enhance the efficiency of compressing Arabic Unicode text using the Lempel-Ziv-Welch (LZW) technique. This method includes two stages: transformation and compression. During the first phase, a multi-level scheme that works according to the level of words, syllables, and characters replaces multi-byte symbols with single-byte symbols, resulting in a binary output of 51%-75% smaller than the actual size and effective for compression. In the second phase: the outputs of the previous phase are received as inputs to the adaptive LZW technique, attached to a value representing the length of the initial phrase (minimum code length). This value is automatically determined according to the size of the data source to enhance the performance of LZW. The original data size is included in the compressed file to be used during the decompression process to detect the length of the initial phrase. The compression ratio achieved by the proposed method was compared to that of the traditional LZW technology that uses multi-byte encoded characters and a fixed initial length phrase, as well as two recent technologies, DEFLATE and Gzip. Experimental results indicate that our method achieves an average compression rate of about 71% and outperforms other methods for all forms of Arabic texts, with improved LZW able to compress an additional 7% or more or less of the files it compresses. Variable-length dictionary LZW continuously displays a significant difference in compression ratios for small files compared to modern methods, whether it uses a variable-width- encoding scheme only or with multi-level encoding as a precompression step. Multi-level schema can be used as a preprocess to other compression techniques, especially those that work efficiently with binary data. Also, the original data volume can be used as a private key within data security and encryption applications.

**INDEX TERMS** Adaptive initial dictionary, Lempel-Ziv-Welch (LZW), multi-dictionaries, multi-level mapping, private key, unicode Arabic text, variable-length phrase code.

#### <span id="page-0-0"></span>**I. INTRODUCTION**

The volume of digital data in the current era is massive, and has grown rapidly. According to a study by International Data Corporation (IDC), the amount of digital data created, captured, and iterated is expected to reach 175 zettabytes by 2025 [\[1\]. T](#page-12-0)his represents a compound annual growth rate (CAGR) of 61%. This rapid growth in digital data has significant implications for storage space and transmission time, highlighting the urgent need to develop and improve data compression techniques.

<span id="page-0-2"></span>Data compression is performed by representing the original symbols in the source data with the fewest possible bits [\[2\]. Co](#page-12-1)nversely, Data decompression is the process of restoring compressed data to its original state. Data compression techniques aim to reduce the amount of storage space

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required, the time needed for transmission over the network, and errors that may occur during data transmission over communication channels. In addition to reducing costs and saving energy when using smart devices  $[2]$ ,  $[3]$ , it enables recent technologies such as big data analytics and machine learning to become more workable and effective.

<span id="page-1-1"></span>Data compression techniques are classified into lossy and Lossless [\[3\],](#page-12-2) [\[4\]. Lo](#page-12-3)ssy: The data are not recovered precisely, and this category is suitable for compressing audio and video files. Lossless: The original data are retrieved precisely from the compressed data; they are suitable for compressing critical data such as X-ray images and text files [\[5\],](#page-12-4) [\[6\].](#page-12-5)

<span id="page-1-4"></span>Text compression is a sub-field of lossless data compression, and its techniques are categorized into two groups [\[2\],](#page-12-1) [\[7\]: st](#page-12-6)atistical and dictionary techniques. Statistical techniques analyze the statistical properties of data to compress them  $[8]$ , whereas dictionary techniques use a dictionary of strings and their corresponding symbols to compress data [\[9\],](#page-12-8) [\[10\].](#page-12-9)

<span id="page-1-7"></span><span id="page-1-6"></span><span id="page-1-5"></span>The dictionary can be static, semi-static, or dynamic. (1) Static: An independent dictionary that does not need to be combined with the compressed data. It is pre-built and holds a fixed set of symbols and corresponding strings. Symbols are mapped to strings based on the order in which they appear in input data. Pictogram notation is one of the most common forms of static dictionary [\[11\],](#page-12-10) [\[12\]. \(](#page-12-11)2) Semistatic: This analyzes the data source and builds a dictionary suitable for encoding data. The dictionary is merged with compressed data before transmission for decompression [\[13\],](#page-12-12) [\[14\]. 3](#page-13-0)) Dynamic or adaptive: The dictionary is constantly built and updated during the compression and decompression processes; it is built dynamically during both processes [\[15\],](#page-13-1) [\[16\]. A](#page-13-2)n example, is LZW.

<span id="page-1-13"></span><span id="page-1-12"></span><span id="page-1-11"></span><span id="page-1-10"></span>All text compression techniques despite their different methods have the same principle for data compression, which is to remove repetition [\[7\],](#page-12-6) [\[17\].](#page-13-3) Repetition appears in texts at several levels, either at the level of bits [\[18\], l](#page-13-4)etters [\[19\],](#page-13-5) [\[20\], s](#page-13-6)yllables [\[21\],](#page-13-7) [\[22\],](#page-13-8) or words [\[15\],](#page-13-1) [\[23\],](#page-13-9) [\[24\],](#page-13-10) [\[25\],](#page-13-11) [\[26\],](#page-13-12) [\[27\],](#page-13-13) [\[28\],](#page-13-14) [\[29\]. T](#page-13-15)he repetition rate for each level varies from language to language.

<span id="page-1-20"></span><span id="page-1-19"></span><span id="page-1-16"></span><span id="page-1-15"></span>The performance of text compression techniques depends on the compatibility of the compression technique method with text properties [\[26\],](#page-13-12) [\[29\]. F](#page-13-15)or example, statistical techniques (e.g., Huffman) are more efficient for high-frequency text compression at the letter level [\[8\]](#page-12-7) and dictionary techniques (e.g., Lempel-Ziv-Welch ''LZW'') are more efficient for high-frequency text compression at syllable and word levels  $[10]$ . The characteristics of text depending on the language to be compressed [\[27\]. E](#page-13-13)ach language has a grammar, morphological structure, coding system, and other characteristics that differ from other languages. For example, English as a European language is characterized by its high frequency at the word and syllable levels, since its letters do not include diacritics. The letter has two cases, uppercase and lowercase, and using a single-byte encoding system called ASCII. As for the Arabic language as a Semitic language [\[28\], i](#page-13-14)ts text is characterized by a high frequency at the level of letters and bits because it is a derivation language, and its letters have one form, and consist of diacritics, in addition to its use of a multi-byte coding system called Unicode [\[30\].](#page-13-16)

<span id="page-1-26"></span><span id="page-1-25"></span><span id="page-1-0"></span>Unicode, specifically UTF-8, is used by 97.8% of all websites [\[38\], w](#page-13-17)hich indicates the need to develop and improve compression techniques for natural languages in general, and Unicode UTF-8 scripts in particular.

Arabic is one of the most spoken Semitic languages ranking fifth in the world [\[28\],](#page-13-14) [\[38\], a](#page-13-17)nd Arabic Unicode UTF-8 scripts are used by 98.9% of all websites according to available usage statistics [\[39\].](#page-13-18)

<span id="page-1-28"></span><span id="page-1-27"></span><span id="page-1-3"></span><span id="page-1-2"></span>LZW is one of the simplest and most effective text compression techniques; however, it is inefficient in compressing the Arabic language  $[40]$ , and its versatility and popularity as a standard technology make it a popular choice for improving Arabic language compression performance.

<span id="page-1-29"></span>Several modifications and improvements have been made to LZW natural language compression technology to achieve the highest possible compression ratio. Some studies have modified this technique's working principle and ignored the language's characteristics so that it can be applied to texts in different languages [\[31\],](#page-13-20) [\[41\]](#page-13-21) (as shown in Table [1\)](#page-2-0). In contrast, other studies take advantage of the inherent features of a particular language to compress text, by modifying or processing the text to fit the underlying principles of the technique [\[22\],](#page-13-8) [\[25\],](#page-13-11) [\[42\],](#page-13-22) [\[43\],](#page-13-23) [\[44\],](#page-13-24) [\[45\],](#page-13-25) [\[46\],](#page-13-26) [\[47\],](#page-13-27) [\[48\],](#page-13-28) [\[49\]](#page-13-29) (as demonstrated in Table [2](#page-2-1) for a specific language).

<span id="page-1-33"></span><span id="page-1-32"></span><span id="page-1-31"></span><span id="page-1-30"></span><span id="page-1-9"></span><span id="page-1-8"></span>This study combines the two methods to reach the maximum possible compression ratio, as it is based on denaturing the data and reducing its actual size before compression, to make it more compressible. Additionally, to setting the minimum initial dictionary size depending on the file size may enhance the performance of LZW when dealing with different sizes.

<span id="page-1-24"></span><span id="page-1-23"></span><span id="page-1-22"></span><span id="page-1-21"></span><span id="page-1-18"></span><span id="page-1-17"></span><span id="page-1-14"></span>The proposed approach includes two phases: (transformation and compression). The first phase aims to convert the text into binary data of less size, regular repetition, and high compressibility, by exploiting several linguistic characteristics of the Arabic language, including the phenomenon of repetition at the level (word, syllable, and letter) to build several static dictionaries of different optimal sizes. The unique case of the Arabic character is to be encoded using unused ASCII code instead of Unicode.

The objective of the second stage, is compressing binary data using Dynamic LZW and enhancing its performance by determining the size of the initial dictionary based on the size of the data source and using the length of a variable length phrase.

The major contributions of the work are listed below, distinguishing it from the few works available in the literature.

1) The proposed multi-level data coding scheme has the capability to work not only with LZW, but also work as a pre-compression step in conjunction with other general compression techniques, particularly those that efficiently compress binary data.

<span id="page-2-0"></span>



## <span id="page-2-1"></span>**TABLE 2.** List of previous surveys on improvements to LZW technology to compress specific natural language.



- 2) provide an up-to-date survey of the improved LZW technique to compress the natural languages.
- 3) Use repetition at multiple levels (words, phrases, letters, and bits) to increase the rate of regular repetition.
- 4) It uses two types of dictionaries that are the optimal size.
	- a) static dictionaries
		- i) Its contents do not exceed about 255 words and 255 Tri-grams, 30 letters.
		- ii) It does not need to be indexed. since it uses the equivalent value storage location as a reference.
		- iii) Unused ASCII character location is exploited.
	- b) A dynamic dictionary deals with phrases of variable length, whose initial values depend on the size of the data source.

The optimal size of dictionaries is essential in reducing overhead costs, and the size of dictionaries positively affect compression and transmission time.

The following is the organization of this paper: Section [I.](#page-0-0)(A) presents the main Arabic language features used in the proposed approach. Section [I.](#page-0-0)(B) explains the working principle of the LZW technique and highlights the factors that impact its performance. In Section  $II$ , we provide a detailed review of existing survey papers related to implementing LZW specifically on Arabic text. Building on this foundation, Section [III](#page-5-1) describes the proposed approach, including the multi-level dictionary construction. Section [IV](#page-8-0) presents experiments and results. Finally, Section [V](#page-12-13) presents the conclusion with some future directions.

#### A. ARABIC LANGUAGE CHARACTERISTICS

Arabic is among the most widely spoken languages, spoken by more than 467 million people [\[50\],](#page-13-30) [\[51\]. T](#page-13-31)here are three types of Arabic texts [\[50\]: C](#page-13-30)lassical Arabic (CA), such as the language of the Qur'an; Modern Standard Arabic (MSA), such as the language of the media, education, and intellectuals, in addition to the Arabic Dialect, which is formed according to the geography of each region or country. Most compression techniques support only one of these types; for example, techniques for compressing Arabic text according to morphological analysis depend on specific patterns and roots, so they do not achieve a high compression ratio when dealing with slang texts, because they are not subject to morphological rules. Also, techniques of General compression will fail due to the letter appearance in different patterns (i.e., with and without diacritics), so does not achieve a satisfactory compression ratio compared to the rest of the languages [\[40\]. T](#page-13-19)he proposed approach is characterized by its ability to handle all types of Arabic languages.

Arabic words are classified into functional and content words. Functional words provide grammatical information rather than content. Functional words play a key role in the overall meaning of a sentence (e.g., prepositions, separate pronouns, and auxiliary verbs). The most important thing <span id="page-3-3"></span>distinguishing them is that although their number is small, their repetition is high  $[52]$ {Citation}. Functional words consist of a small number of letters between two and five, especially in the absence of diacritics, as shown in Table [3](#page-3-0) [\[47\].](#page-13-27) Therefore, the possibility of being part of another word is large; for example, (''kan- '' is part of the word ''makan- ''). Therefore, it is common for the function word to be repeated as an independent word or as a part of a word. Content words: any word that is not functional, including (nouns, verbs, and adjectives). The proposed approach replaces a word with a shorter binary value; the function words are encoded at the word level, and the content words are encoded at the word level if they appear as part of another word, at the syllable level, and at the letter level.

<span id="page-3-0"></span>**TABLE 3.** Frequency of some function words.



<span id="page-3-4"></span>The Arabic words consist of a series of alphabetic letters and diacritics [\[53\]. T](#page-13-33)he number of Arabic letters is 28. The most important characteristic of Arabic letters is that each letter has only one case, unlike English letters, that have two cases: capital or small letters. In addition, the number of Arabic letters is small and their frequency varies, as shown in Fig. [1](#page-4-0) [\[54\].](#page-13-34)

<span id="page-3-6"></span><span id="page-3-5"></span><span id="page-3-2"></span><span id="page-3-1"></span>The 8 diacritics are connected to the letter so that, found above or below the letter  $\binom{1}{1}$  [\[55\]. T](#page-13-35)he diacritics are optional. If they appear with the letters of the words (e.g., -kataba), the text is termed (full vowels). In this case, the frequency of the diacritics is high, but if an appearance on some letters of the words (e.g., -writer), the text is termed (partial vowels), and if the letters of the words are stripped from any diacritics (e.g., -written) the text is termed (Un-vowels). The proposed approach deals with all forms of Arabic text and takes advantage of the letter case to encode it using unused ASCII code.

Arabic relies on affixing to generate and develop verbal wealth, through syllabic appendages that stick to their original material in the form of affixes (prefixes, infixes, and suffixes) [\[50\], w](#page-13-30)hich consist of two letters (bigrams) or three letters (trigrams). Examples of these affixes are: as shown in Table [4](#page-4-1) Statistical studies have shown that the frequency of adhesions is high and their number is limited [\[56\].](#page-13-36)

<span id="page-3-7"></span>The proposed approach takes advantage of this feature to generate an optimally sized static dictionary that encodes the data source at the segment level.

<span id="page-3-8"></span>Arabic characters and their diacritics are encoded according to the universal Unicode principle [\[57\]. U](#page-13-37)nicode has

<span id="page-4-0"></span>

**FIGURE 1.** Arabic letter frequency distribution, sorted according to frequency of letters.

two main encodings, UTF-8 and UTF-16, both of which are designed for specific purposes. In the proposed approach, the test texts are stored according to the UTF-8 encoding system, which is currently the most widely used system globally and is a source for more than 92% of web pages. An un-vowel character is encoded as two bytes and a vowel character as four bytes, resulting in inefficient use of storage space. According to earlier studies, replacing ASCII code with Unicode code reduces the file size and improves compression by 50% [\[45\],](#page-13-25) [\[58\],](#page-13-38) [\[59\],](#page-14-0) [\[60\]. T](#page-14-1)he proposed method uses a similar method for n-gram encoding [\[61\], w](#page-14-2)ith the difference that the value of n represents a character, affixing, or a word.

#### <span id="page-4-4"></span><span id="page-4-3"></span><span id="page-4-2"></span><span id="page-4-1"></span>**TABLE 4.** Example form of affixes.



The proposed approach exploits several linguistic characteristics of the Arabic language to make the text more compressible, characterized by its ability to handle all types and forms of Arabic language. It is based on the phenomenon of redundancy at the word level, then at the n-gram level, and then at the character level, taking advantage of the unique case to encode it with a non-ASCII code user instead of Unicode.

#### B. LZW TECHNIQUE

LZW is a universal lossless compression technique, and it is one of the most powerful compression techniques. Efficient for files with repetitive data [\[5\],](#page-12-4) [\[12\]. S](#page-12-11)imple, and does not require a priori knowledge of the file structure, data types, or usage statistics.

LZW Has a dynamic dictionary that includes strings and codes. Replaces strings of characters with single codes. The following steps show the pseudo-code for the LZW algorithm [\[37\]:](#page-13-39)

- 1) Initialize the dictionary with all possible characters.
- 2) Read the first character from the input data and assign it to C.
- 4) Check the dictionary for the string ''S''.
	- a) If found,
		- i) repeat steps 3.
		- b) If not found,
			- i) output code for "C",
			- ii) save ''S which is now called *phrase*'' to the dictionary
			- iii) reset " $C$ " to " $E$ ".
- 5) Repeat steps 3-5 until the end of the sequence.

The size of the initial dictionary is  $2^{\wedge}$  the length phrase (which is the code for the new entries). The dictionary adapts to the data being compressed, as the algorithm updates it dynamically during processing.

Several factors affect the performance of the LZW method when used for text compression:

- <span id="page-4-6"></span>(a) Structure of text  $[21]$ ,  $[29]$ ,  $[62]$ : LZW depends on text structure, target language characteristics, and pattern repetition rate.
- (b) Text length  $[42]$ ,  $[45]$ : LZW is not ideal for compressing short texts because it limits repetition.
- <span id="page-4-8"></span><span id="page-4-7"></span><span id="page-4-5"></span>(c) Dictionary size  $[36]$ ,  $[63]$ ,  $[64]$ : The dictionary size affects LZW's performance by balancing the compression ratio and processing time. A larger dictionary leads to better compression but also uses more memory and processing power. A smaller dictionary reduces memory and processing requirements but may result in lower compression. The optimal dictionary size is determined by testing and balancing the different sizes. Commonly, a dictionary size of 4096 or 8192 entries provides good results. Their sizes can be adjusted according to specific needs.
- <span id="page-4-9"></span>(d) Phrase length  $[45]$ ,  $[63]$ ,  $[65]$ : If its length is short compared to the size of the data source, it creates a chain of new entries that are not used and takes up space in the dictionary. Conversely, if it is long, it produces a new code string with a larger number of equivalent bits.
- <span id="page-4-11"></span><span id="page-4-10"></span>(e) Text character set  $[49]$ ,  $[66]$ : LZW was initially designed to compress text encoded in the ASCII character set. Therefore, this technique is unsuitable for text containing characters from multiple bytes, such as Utf-8 used by 97.8% of character-encoded websites [\[67\].](#page-14-8)

LZW works more efficiently for binary files with all their contents either 1 or 0 because it replaces sets of bits (instead of strings of characters in text files) with single codes [\[45\],](#page-13-25) [\[40\].](#page-13-19)

The LZW algorithm doesn't always provides an ideal compression result, especially when dealing with Arabic Text [\[40\]. T](#page-13-19)herefore, many studies have been published to improve the performance of LZW compression in natural languages [\[45\],](#page-13-25) [\[46\],](#page-13-26) [\[47\].](#page-13-27)

In this study, we aim to increase the compression ratio of Arabic texts of all types by compressing the data source that has been processed as binary data, setting the initial

dictionary size and code word length based on the size of the data source, and making its variable-width

## <span id="page-5-0"></span>**II. RELATED WORK**

In recent years, the LZW technique for compressing natural language texts has been widely discussed in the literature, resulting in various improvements being introduced and implemented. However, the focus on the Arabic language in these studies has been limited, with some based on word level [\[47\], a](#page-13-27)nd others based on character [\[45\]](#page-13-25) or segment level [\[46\].](#page-13-26)

Our previous study [\[46\]](#page-13-26) introduced a new hybrid technology for compressing Arabic texts, which effectively utilizes the morphological and grammatical features of Arabic to enhance the performance of compression ratio for LZW and BWT methods. The proposed method involves two stages: morphological analysis and compression.

During the morphological analysis stage, a multi-layered model is used to categorize the text into functional words, derivative words, and other words, along with a fourth layer to link words to their original positions in the input text. The root pattern dictionaries technique is then utilized to replace derived words with index values based on a dictionary of 4096 roots and 2048 patterns, while function words are encoded using a single byte based on a dictionary of 128 words. These dictionaries do not need to be transferred with compressed files, reducing transmission time. However, the morphological analysis stage requires more time and effective storage space.

In the compression stage, general compressors are used to compress the four layers separately. The LZW and BWT methods are applied, and the results are compared. The comparison showed an improvement in the performance of both techniques by 0.25 and 0.23, respectively.

In [\[45\]](#page-13-25) a comparison of four techniques, namely Eilias, Golomb, Huffman, and LZW, was presented. These techniques were applied to Arabic text as a binary formula. LZW showed the best compression ratio and decoding time for large file sizes (above 300 KB), with a compression ratio of 24%. However, LZW was ineffective in compressing small files due to the fixed length of the code word (15), which prompted the researchers to recommend a variable codeword length based on the file size.

Moreover, the researchers introduced the Arabic character mapping technique to enhance the compression ratio of the three statistical techniques (Golomb, Elias, and Hofmann). Results indicated that implementing the Arabic character mapping technique improved the compression ratio of these techniques compared to the binary approach. Nonetheless, Huffman with character mapping outperformed other techniques on average sizes, including LZW, but only for small binary data. The authors proposed using an Arabic Character Mapping approach with LZW to increase the compression ratio for all file sizes.

In [\[46\]](#page-13-26) introduced a new technique for compressing Arabic text files based on encoding text at the segment level. Its effectiveness is in using n-grams and window size to create a dynamic dictionary, which is then used to encode text with the smallest number of bits. It can be used to reduce the sizes of different text files, in English or Arabic in all their forms. The achieved compression ratio was 43.87%.

Authors in [\[43\]](#page-13-23) changed the LZW (Lempel Ziv Welch) technique to compress the Unicode Arabic text to reduce the number of dictionary entries by using an initial blank dictionary and an additional dictionary that is later included with the zip file. The proposed modification was not only tested on Arabic texts and applied to other texts such as Bengali, Tamil, and Malayalam with varied sizes. The tests showed that the results of applying the proposed modification were superior to the traditional byte-based LZW compressors. Table [5](#page-6-0) presents a comparison of a surveyed and reviewed research work on arabic text compression using LZW.

#### <span id="page-5-1"></span>**III. PROPOSED METHOD**

This study proposes an approach to improve the LZW compression ratio for Arabic texts by transforming text files into binary files to make them more compressible using Adaptive LZW with a variable length phrase and setting its initial value based on the size of the data source to reinforce the compression ratio of texts.

The proposed approach works in two stages: transformation and compression, as shown in Fig. [2,](#page-5-2) in which the text is set with predefined shorter codes to reduce the actual size of the original file. It uses several static and separate dictionaries. In the second stage, the output of the first stage is compressed using the Dynamic LZW technique, because it works efficiently with binary data. It begins with reading a string of bits, whose initial length depends on the size of the data source, and changes based on the size of the dictionary.

<span id="page-5-2"></span>

**FIGURE 2.** General description of the proposed approach.

To accurately decode from the three dictionaries, we implemented a flag code during the transforming phase to identify the reference dictionary for the original data. Fig. [3](#page-6-1) shows an example of transforming the word ''Alhamdulillah- ''.

#### A. GENERATE DICTIONARIES

Repetition is a linguistic phenomenon known as Arabic in the oldest texts. It appears in different forms at three levels. At the letter level, 16% of the letters in Arabic text were

#### <span id="page-6-0"></span>**TABLE 5.** Comparison of related work on Arabic text compression using LZW.



<span id="page-6-1"></span>

**FIGURE 3.** Example of transforming the word ''Alhamdulillah- ''.

spaces. At the word level, earlier studies have indicated that 40% of the words in Arabic texts are function words [\[52\].](#page-13-32) At the syllable level, it has several forms, including suffixes, distinguished by their limited numbers.

According to the three recurrence levels, the transformation phase was based on three independent dictionaries.

#### 1) DICTIONARY OF WORDS

It is used for coding the function word by 10 bits. It has the 128 most common and often-used function words. We selected them from the OSAC corpus [\[56\],](#page-13-36) [\[68\]](#page-14-9) and arranged them in the dictionary descending according to their frequency.

<span id="page-6-3"></span>Then we used a formal tool called "Shakili" [\[69\]](#page-14-10) to form the same words complete formation and added them to the same dictionary and in the same order.

<span id="page-6-4"></span>El-Khair [\[70\]](#page-14-11) proved that if function words are replaced by fixed-length codes whose length is less than their average size, the size of the input text is reduced. Accordingly, we suggested that the functional word be represented by 1 byte, as shown in Fig. [4.](#page-7-0)

<span id="page-6-2"></span>The un-vowel Functional words mainly consist of two or three letters. Accordingly, to that a functional word may appear as part of another word. Therefore, the designation is based on whether the match is full or partial. For example, the word to (God-ملله) is part of the word (praise-الحَمدالله).

<span id="page-7-0"></span>
$$
\begin{array}{c|c}\n\hline\n11 & 0000000 \\
\hline\n\end{array}
$$
\nFlag

\nThe binary value

\nconjugant rules

equivalent value storage location

of

**FIGURE 4.** Functional word dictionary output structure.

Words without diacritics are 2-5 characters long and need 4-10 bytes of storage space. The proposed method replaces the function word with 10 bits, which saves storage space by 75%-90%.

#### 2) DICTIONARY OF AFFIXES AND FORMED LETTERS

It replaces vowel characters (i.e. chars with a diacritic) or affixes by a ten of a bit. This dictionary contains two groups: The first group includes the most common and frequent suffixes, determined based on Arabic grammar books and arranged randomly. The second group includes Arabic letters in all their forms, for example If we symbolize the Arabic letter  $(-)$  It may appear in one of the following forms  $\frac{1}{2}$ ;  $\frac{1}{2}$ ,  $\frac{1}{2}$ ).

Usually, the character is encoded according to UTF-8 with four bytes (two bytes for characters and two bytes for movement); The proposed method replaces vowel characters or affixes with 10 bits Fig. [5,](#page-7-1) which reduces the character size by at least 69%.

<span id="page-7-1"></span>

**FIGURE 5.** Affixes and formed letters dictionary output structure.

#### 3) DICTIONARY OF SINGLE LETTERS

Unused ASCII character locations from 64 to 127 have been exploited to designate Arabic characters, single vowels, numbers, punctuation marks, and symbols. Therefore, the Arabic character is represented by 8 bits instead of 16 bits (as shown in Fig. [6\)](#page-7-2) to obtain an effective storage space and reduce the data size by at least 50%, as many studies have proven the efficiency of this approach in improving the compression ratio [\[45\],](#page-13-25) [\[58\],](#page-13-38) [\[59\],](#page-14-0) [\[60\].](#page-14-1) We arranged the Arabic letters in descending order of frequency.

We made sure to arrange the content of the dictionaries according to the most frequent ones to preserve redundancy in the data source because it is the main factor in raising the compression ratio in the next stage.

<span id="page-7-2"></span>

**FIGURE 6.** Single letters dictionary output structure.

#### B. TRANSFORMATION STAGE

Fig. [7](#page-8-1) illustrates the flowchart of the first stage. The first step begins by reading one word at a time to search for its equivalent value starting in the dictionary of words (D1); if a perfect match is found, the binary value of the location of this word is returned, ''11'' was added at the beginning as a reference to the dictionary used when decoding and then moving to read the next word.

If no perfect match was found, it searched for the partial match with the largest number of partial character similarities and replaced the matching part with the binary value of its location, adding (11) at the beginning as a reference to the dictionary. It then returns to the first step to complete the search for the remainder of the non-matching part.

Suppose no match was found in the word dictionary. In that case, the segment dictionary (D2) is searched to replace the affixes or characters attached to the diacritics with the binary value of the matching location, adding ten at the beginning as a reference. Otherwise, the replacement is performed at the character level using the third dictionary (D3) to return the binary value of the location of the character it matches, noting that it is equivalent to one of the unused ASCII values consisting of seven bits preceded by 0 as a reference; otherwise, it returns the binary value of the ASCII value of the entered data. Spaces are not ignored because they are the boundaries between compound and simple words. Symbols, numbers, and punctuation were replaced with a 7-bit ASCII code, followed by 0 for reference.

#### C. COMPRESS STAGE

The LZW technique receives the output of the earlier step as a binary input for compression.

Typically, traditional LZW uses a fixed length code of 12 bits to output the code; therefore, the dictionary size is 4096, and when the dictionary is full, LZW becomes static. This approach may increase the encoded message length of small messages compared with the original text, especially UTF-8 encoding has variable length characters from 1 to 4 bytes, which leads to deterioration of the compression ratio, so our proposed approach uses dynamic phrase length, which changes every time the dictionary limit is reached.

The initial input values of the dictionary are based on the size of the initial phrase, which is determined according to the size of the data to be compressed and then included with the compressed data to be used in the decompression stage.

<span id="page-8-1"></span>

**FIGURE 7.** Flowchart for the first stage of the proposed approach.

It should be noted that traditional LZW compression replaces strings of characters with a single symbol. In contrast the proposed method implements LZW to replace strings of Bits with single symbols because; in the precompression stage, the nature of the data is changed to obtain a better compression ratio.

#### <span id="page-8-0"></span>**IV. EXPERIMENTAL RESULTS AND DISCUSSION**

To evaluate the performance of the proposed approach, we prepared three dictionaries according to the method described in the previous section, and shared them for both the encoder and decoder modules. We then performed three sets of experiments on Arabic text files, which were obtained from the OSAC Corpus [\[56\],](#page-13-36) [\[68\]](#page-14-9) removed the HTML tags from the text and stored them in UTF-8 encoding.

We used the "Shakali" tool [\[69\]](#page-14-10) to form the same texts partially and completely; that is, we tested the same text in

three shapes, as well as text files from the Internet. We conducted a second set of experiments to determine the length of the initial phrase code for which the compression stage relies on the generation of the first dictionary entries.

We used Python to implement the design and tested it on a 2.4GHz CPU, 4.00GB RAM, a 64-bit operating system, and Windows 10.

The compression ratio serves as a metric to gauge the efficiency of a compression method, with higher ratios indicating better quality. the compression ratio can be calculated by [\(1\)](#page-8-2):

Compression ratio (CR)

<span id="page-8-2"></span>
$$
= \left(1 - \left(\frac{\text{number of compressed bits}}{\text{numbers of uncompressed bits}}\right)\right) \times 100\% (1)
$$

Table [6](#page-9-0) compares the performance of the proposed technique (TLZW) with that of the traditional LZW (SLZW)

<span id="page-9-0"></span>



technique in terms of bit compression ratio. It should be noted that a variable dictionary width was used for both, the difference is the initial dictionary values and the length of the initial phrase code).

The proposed method showed better results than the traditional method for all types of Arabic text, as it did not depend on the structure of words or any grammatical or morphological rules and was better for all forms of text. These results could be attributed to several factors the nature of the data is changed from textual to binary using multi-level encoding to obtain the most regular frequency. However, the size of the original file was reduced prior to the compression.

The results also showed that the file reduction rate before compression ranged between 51% and 57%, depending on the text type and level of mapping used. This indicates that the proposed method can effectively reduce the size of Arabic text before compression, resulting in a higher overall compression ratio than the traditional method.

Fig. [8](#page-10-0) shows the results of compressing Arabic texts with all three forms of the same size. The vowel-text compression results were better than those of the partial-vowel and un-vowel texts, respectively. Since diacritics are based on

movements whose number is limited to seven [\[53\],](#page-13-33) the probability that each movement appears with 29 characters increases the repetition at the syllable level, which is a major factor in increasing the compression ratio. This indicates that the proposed method depends on the content; therefore, it is the most effective when applied to text with vowels.

The results in Fig. [9](#page-10-1) show an inverse relationship between the original file size and the optimization ratio (i.e., the compression ratio of the traditional method is subtracted from the compression ratio in our approach). It is also noted that the proposed approach achieves the best results for small texts compared to larger texts. This may be owing to the mapping of many unused bits in the dictionary, and the extension of the dictionary size. In the first set of pretests, the phrase was dynamic and had an initial length of 8 bits.

Table [7](#page-10-2) shows the results of the second set of tests, which aimed to study the relationship between the initial phrase length (i.e., the minimum in the dictionary) and compression ratio. Experiments were conducted on several Arabic texts in three forms, with sizes ranging from [\(1\)](#page-8-2) to (200) kilobytes. The same file was tested several times, in which the encoder length was manually specified and passed along with the

<b>File Name</b>	<b>Size File</b> in Kbyte	<b>TLZW</b> <b>PHARSE</b> $SIZE=1$	<b>TLZW</b> <b>PHARSE</b> $SIZE=2$	<b>TLZW</b> <b>PHARSE</b> $SIZE=4$	<b>TLZW</b> <b>PHARSE</b> $SIZE=6$	<b>TLZW</b> <b>PHARSE</b> $SIZE=7$	<b>TLZW</b> <b>PHARSE</b> $SIZE=8$	<b>TLZW</b> <b>PHARSE</b> $SIZE=9$	<b>TLZW</b> <b>PHARSE</b> $SIZE=10$	the Most Effi- cient
File1		55.13	62.96	69.69	70.63	68.39	67.97	65.99	65.06	6
File <sub>2</sub>	5.9	55.75	62.86	67.03	69.23	68.08	68.27	65.74	65.74	6
File3	11.6	59.44	66.75	70.18	72.3	70.00	71.94	71.6	70.01	6
File4	12	56.33	63.53	67.26	69.55	68.08	69.57	66.95	67.9	8
File5	52.7	58.85	62.88	65.29	66.8	68.42	68.74	68.39	67.04	8
File6	100	60.04	64.22	67.31	69.06	69.66	70.45	70.32	70.28	8
File7	132	61.53	65.08	67.79	69.23	69.85	70.26	70.32	70.23	9
File8	150	59.95	63.84	63.84	66.96	68.53	69.4	69.97	70.16	9
File9	200	61.53	65.08	67.79	69.23	69.85	70.26	70.32	70.23	9

<span id="page-10-2"></span>**TABLE 7.** Relation between the initial phrase length and the original data size on compression ratio.

<span id="page-10-0"></span>

**FIGURE 8.** Compressing Arabic texts with three forms of the same size.

encrypted data to the compression stage, where LZW created an initial dictionary of size  $(2^{\wedge})$  phrase length) and began reading a string of bits from the data source of size equal to the phrase length.

The results indicate that the length of the initial phrase affects the compression ratio, and the appropriate length when compressing files ranging in size from 1 to 11 Kilobyte is six. For files with sizes of 12 to 100, it is 8, and for files with sizes of 100 to 200, the length of the most efficient phrase is 9. Based on these results, the programming of the proposed method was changed to automatically pass a phrase length to the LZW technique, depending on the data size. Create an initial dictionary with a size equal to  $2^{\wedge}$  "phrase length" before compression and decompression.

Fig. [10](#page-11-0) comparison the static and dynamic modes of the initial phrase length and their impact on TLZW performance. The results indicate that limiting the initial phrase length according to the file size increases the compression ratio, which is considered an enhancement of our approach when dealing with large sizes. We recommend testing the proposed

<span id="page-10-1"></span>

**FIGURE 9.** Relationship between the original file size and the optimization ratio.

approach by using large files to determine the optimal phrase length.

In our final set of experiments, we sought to compare our method's compression ratio with that of two other modern compression methods: Deflate, which employs a combination of Huffman coding and LZ77 sliding window compression, and Gzip, which utilizes Deflate in combination with a file format containing additional metadata. Gzip is currently the most widely used and effective compression format on the web that can reduce the size of text files by up to 90%.

Table [8](#page-11-1) presents a detailed comparison of our proposed method with traditional and modern compression techniques, while Fig[.11](#page-11-2) provides a summary of the results.

Our results show that our proposed method outperforms other methods for all forms of Arabic texts, which may be attributed to its dependence on two main principles:

First, the method takes advantage of the unique features of the Arabic language by proposing a multi-level coding system as a precompression step.

#### <span id="page-11-1"></span>**TABLE 8.** Comparison of our proposed method with traditional and modern compression techniques.



<span id="page-11-0"></span>

**FIGURE 10.** Comparison of the static and Adaptive modes of initial phrase length and their impact on TLZW performance.

This system modifies and aligns text with the basic principles of LZW technology, which include:

- 1) Converting text data into binary data, so that the performance of the technology is not affected by the structure of words or grammatical and morphological rules.
- 2) Reducing the size of the data before compression, by 51% - 57%, which reduces the deterioration of the size of the technical dictionary as much as possible.
- 3) Obtaining high-frequency and regular data through the use of fixed dictionaries that are optimal in size, containing no more than 255 words and 255 trigrams (30 letters), and do not require indexing since they use equivalent value storage locations as references. Additionally, unused ASCII character locations are exploited.

Second, adapt LZW's working principle to accommodate input data by setting initial values for the word length of the initial phrase, the initial dictionary data, and the use of variable dictionary size according to the size of the data source.

<span id="page-11-2"></span>

**FIGURE 11.** Compression ratio comparison between our method, Standard LZW, Deflate and GZIP.

Thus, our findings indicate that the multifactorial approach is effective in enhancing compression ratios. These results

have important implications for data compression in the storage, transmission and retrieval of Arabic language texts.

It should be noted that the performance of the proposed technique is better for texts with vowel characters than for non-vowel texts, and for small files compared to large files. Small files refer to texts that are small in size and complexity as they limit the key factor of compression technologies which is redundancy, and can be found in IoT devices, mobile applications and web applications. So small data compression is important to save storage and bandwidth, improve processing efficiency, and ensure data security.

#### <span id="page-12-13"></span>**V. CONCLUSION**

In this paper, a new approach for compressing Arabic text using LZW is presented, which includes two stages: conversion and compression, the results of its implementation are discussed.

In the transition phase, the proposed approach effectively exploits the phenomenon of repetition that distinguished the Arabic language at various levels (words, syllables, and letters) to reduce the actual file size by 51%-75%. The text file is converted to binary as an initial step before compression using adaptive LZW technology.

An evaluation of the proposed approach in terms of the amount of compression demonstrated that its performance was better than that of the traditional adaptive LZW technique applied directly to the text. The results also indicate the importance of determining the first phrase's length based on the data source's size and using a variable-length dictionary to improve the compression ratio.

Although the proposed approach uses Adaptive LZW technology in the compression stage, the outputs of the first stage can be embedded with any other general compression technique, particularly the one that works efficiently with binary data.

The main advantage of the proposed approach is that there is no need for statistical or morphological analysis of the text coding. There is no need to send dictionaries to compressed files. The dictionaries used in the first stage were fixed and independent of the file. The dictionary used in the compression stage was adaptive and constructed during the compression and decompression processes. In addition, the size of fixed dictionaries is ideal as it does not exceed 640, and it uses the location of the equivalent value to represent the input as a binary value. In addition, it exploits the location of unused ASCII characteristics. The LZW deals with phrases of variable length, whose initial values depend on the size of the data source. The optimal size for dictionaries reduces public expenditure costs and may positively affect the time of compression and transmission. We propose this perspective as a direction for future research.

In conclusion, our research aimed to improve the performance of LZW compression in Arabic texts. Through a series of experiments on Arabic texts of various shapes and sizes, we found that the performance of the compression technique depends on the characteristics of the language, which must

achieve a balance between the characteristics of the language and the style of the technique to be represented by the smallest possible size. Concerning LZW, the length of the initial string code, which varies depending on the size of the data, plays vital role in increasing the performance of LZW compression. The results of this study have important implications for data compression and pave the way for further research in this field.

#### **VI. FUTURE WORK**

In future research, we recommend combining a multi-level data encoding scheme with other compression techniques to improve the overall compression ratio. This improvement will contribute to enhancing the performance of mobile devices, saving energy, reducing network consumption, and improving communication efficiency during data transmission and reception in Internet applications and cloud applications.

In addition, it will be interesting to explore the optimal length of initial and variable phrase encryption when compressing large text files using LZW technology and using it as a private key in data security and cryptography applications to improve security and data protection.

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