



# A Comparative Analysis of Text Mining Techniques and Algorithms

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## ABSTRACT

*With the abundant technological progression and its colossal consumption develops the gigantic quantity of unstructured text data digitally. This type of data controlluxurious information as well as knowledge. Therefore, in order to extract such an amount of knowledge from unstructured text data, a data expert involve to perform mining techniques over textual data. Text mining is the procedure of extracting hidden, priory unidentified, as well asconsiderablyutilizeful information from unstructured textual data.Web browsers became an significantas well as implement to create the information available at our finger tips. World Wide Web became with information as well as it became tough to regaindata according to the required data. Text mining is a subdivision under web mining. This paper deals with a study of different techniques, pattern of content text mining and the areas which has been influenced by content mining. The web contains efficient, unstructured, partiallyprearranged and multimedia data. This paper focuses on text mining techniques and its algorithmswhich help to retrieve data information in huge data retrieval in content based method.*

**KEYWORDS:** Text mining, Web Usage Mining, Summarization, Clustering, Information retrieval

## 1. INTRODUCTION

Data Mining is a set of techniques that aims to determine implicit utilizeful information as of big data Web mining helps to understand customer behaviour, estimate the presentation of a web site as well as the explore donein web content mining ultimately helps to enhanceproduction.Nowadaysmainly of the information in government, industry, business,as well as other institutions are stored electronically, in the formof text databases. Data stored in most text databases arepartially structured data in that they are

neither completelyunstructured nor completely structured. Webcontent mining examines the search effect of search engine.Physicallyexploitbelongings consumes a assortment of instance. The datato be analyzed is in bulky quantities, and then it is unbreakable to discover outthe appropriateinformation. As now in every field of life manual workis replaced by technology, the overall process of discoveringpotentially utilizeful previously unknown information orknowledge from the web data. Web mining is utilized tocaptureapplicable information,

creating novel familiarity out of the relevant data, personalization of the information, learning about Consumers or individual utilizes as well as numerous others. Several data mining techniques consist of mining imperative patterns in text documents. However, how to successfully utilize and update exposed patterns is still an open research issue, especially in the domain of text mining. Text mining is a procedure to take out attractive as well as important patterns to investigate knowledge as of textual data sources [3]. Text mining is a multiple department opinion depends on information retrieval, as well as computational linguistics. Numerous text mining techniques like summarization, classification, clustering etc., can be functional to extort knowledge. Text mining can handle with natural language text which is stored in semi structured and unstructured format [4]. Text mining techniques are frequently useful in industry, academia, web applications, and internet as well as technical fields. Application areas like search engines, customer relationship management system, filter emails, product suggestion analysis, fraud detection, and social media analytics utilize text mining for opinion mining, feature extraction, sentiment, predictive, and trend analysis [6]. Technically, text mining is the utilize of automated methods for exploiting the enormous amount of knowledge available in text documents. Text Mining represents text retrieval and it is a relatively novel and vibrant research area which is changing the emphasis in text-based information technologies from the level of retrieval to the level of analysis and exploration. Text mining, on occasion moderately invoke to as text data mining, assign normally to the process of originate high quality in sequence because text. Analysers adore and others censorious to facilitate text mining is in addition to known as Text Data Mining and knowledge Discovery in Textual Databases.

## 2. RELATED WORK

T. Chen et al [5] described that assembly, extracting, pre-processing, text transformation, feature extraction, pattern selection, and evaluation steps are part of text mining process. In calculation, dissimilar expansively utilized text mining techniques, i.e., clustering categorization, decision tree

categorization, application in various fields are surveyed.

R. Bhayani et al [8] highlighted the issues in text mining applications and techniques. Unstructured text is difficult as compared to structured or tabular data utilizing traditional mining tools as well as techniques. The applications of text mining process in bioinformatics, business intelligence as well as national security system. A natural language processing as well as individual recognition technique has condensed the problems that occur during text mining process.

D Ramesh et al [9] explored MEDLINE biomedical database by integrating a framework for named entity recognition, classification of text, hypothesis generation, testing, relationship, synonym extraction, extract abbreviations. This novel framework helps to remove unnecessary details as well as remove valuable information.

Shailesh Pandey et al [10] analyzed the text using text mining patterns and displayed term based approaches cannot analyze synonyms and polysemy appropriately. Moreover, a sample representation was calculated for measurement of patterns in terms of conveying weight according to their distribution. This approach helps to improve the competence of text mining process.

P. Monali et al [11] obtainable a crime recognition system utilizing text mining tools and relation discovery algorithm was calculated to associate the term with contraction. Information mining is the expectation equipment for massive data sets it serves to huge association center approximately the more considerable information. It's an appliance to predict the approaching patterns, qualifying association to dissolve on palm on information ambitious choices.

J. Bollen et al [7], has explained in item surveys, it is seen that the circulation of limit appraisals over audits collected by a variety of clients or assessed need on diverse themes are regularly slanted in reality. Thusly, fusing client and item data would be utilizeful for the assignment of notion characterization of audits. In any case, existing methodologies overlooked the transient idea of surveys posted by a similar client or assessed on a similar item as well as to contend that the fleeting relations of surveys may be possibly valuable for learning client and item installing and subsequently suggest utilizing a grouping model to insert these sophisticated relationships into client and



item portrayals in command to develop the exhibition of report level estimation examination.

### 3. TEXT MINING TECHNIQUES

#### 3.1 Classification

Text classification is the progression of classifying documents into predefined division established on their contented. It is the programmed obligation of natural language texts to prearranged division. Text classification is the crucial constraint of text retrieval systems, recover texts in reaction to a utilize query, and text understanding systems, whatever transform text in a quantity of way such as developing text summaries, answering questions otherwise extracting data. Available supervised learning algorithms to robotically classify text require adequate documents to discover precisely. Categorization is to put things according to their characteristics. Given a set of class, classifier determines which classes a given object belongs to. Documents may be classified according to their subjects or the other attributes such as document type, author, printing year etc.

Classification [2] resources conveying a document otherwise object to one or more classes. This may be done manually or algorithmically. The intellectual classification of documents is mostly utilized in information science and computer science. Classification is prepared generally depends on traits, performance or subjects. The Classification problem can be stated as a training data set agreeing of proceedings. Each record is identified by a unique record id, and consists of fields corresponding to the aspects. An element with a continuous domain is called a continuous attribute. An attribute with a finite domain of discrete values is called a categorical aspect. Classification is the process of discovering a model for the class in expressions of the continuing attributes. The objective is to utilize the training data set to build a model of the class label based on the other attributes such that the model can be utilized to classify novel data not from the training data set attributes. Other type of classification techniques are also utilized which comes under supervised classification and unsupervised classification.

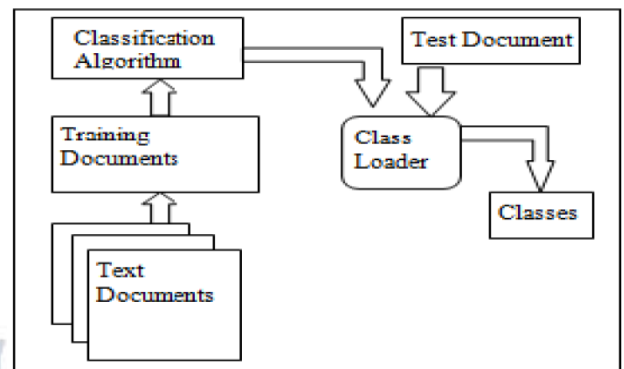


Fig 1.1 Work Flow of Classification

The above figure 1.1 explain the work flow of classification using text document for training data.

#### 3.2 Clustering

Clustering is individual of a large amount ordinary investigative data analysis technique utilized to acquire an perception concerning the construction of the data. The situation be able to be definite as the charge of classifying subgroups in the data such that data points in the matchingsubcategorycluster are enormously similar although data points in altered clusters are exclusively miscellaneous. The decision of which similarity measure to utilize is application-specific. The clustering process section is designed to cluster the documents with reference to its relationship. The clustering process groups the documents. The clustering process is alienated into two primary modules. They are term cluster and semantic cluster. The term cluster module is considered to cluster the manuscript with the term weights. The semantic cluster groups the document with semantic weights. Clustering documents can also in addition be done by looking at every document in vector format. But documents infrequently contain context. The furthest procedure to script is to offer every word in the dictionary its hold vector measurement and then just count the occurrences for each word from the entire article.

#### 3.3 Information Retrieval

Information retrieval is a countryside so as to have been budding in parallel with database systems for many years. Unlike the field of database systems, which has focus on query and operation processing of structured data, information retrieval is disturbed with the organization and retrieval of information from a

large number of text-based documents. Since information retrieval as well as database systems each handle different kinds of data, some database systems struggle are usually not present in information retrieval systems, such as concurrency control, recovery, transaction management, and update. Also, some common information retrieval problems are usually not encountered in traditional database systems, such as unstructured documents, estimate search based on keywords, and the notion of relevance. Outstanding to the abundance of text information, information retrieval has established various applications. Around happen numerous information retrieval structures, such as on-line library sequence systems, on-line manuscript organization schemes, as well as the more freshly established web search engines. A typical information retrieval problem is to locate relevant documents in a document collection based on a user's query, which is often some keywords describing an information need, although it could be relevant document. In such a search problem, a user takes the initiative to "pull" the relevant information out from the collection; this is most appropriate when a user has some ad hoc information need, such as finding information to buy a used car. When a user has a long-term information need, a retrieval system may also take the initiative to "push" any newly arrived information item to a user if the item is judged as being relevant to the user's information need. Since a practical outlook, search as well as clarifying segment several collective techniques.

### 3.4 Information Extraction

Information extraction (IE) is the assignment of automatically withdrawn prearranged information beginnings shapeless or semi-structured text. In supplementary dispute evidence abstraction can be measured as an imperfect arrangement of occupied natural language syntactic, where the information remains observing aimed at are recognized beforehand. IE is one of the disapproving responsibilities in text mining as well as extensively deliberate in diverse research societies such as information retrieval, natural language processing and Web mining. Information extraction includes two fundamental tasks, namely, name entity recognition and relation extraction. The states of the art in both tasks are statistical learning methods. The common persistence of Knowledge Detection is to

"extract contained, previously unknown, and potentially useful information from data". Information Extraction IE mostly agrees with classifying words or mouth languages as of inside a documentary file. Feature positions can be well-defined as those which are sprightly connected to the province.

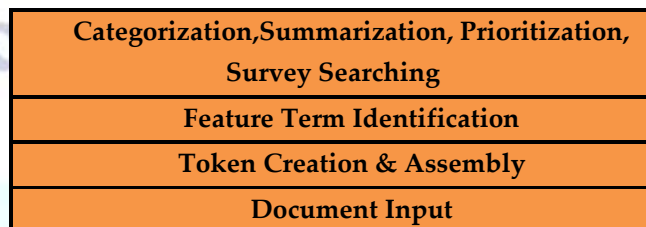


Figure 1.2 A layered model of the Text Mining Application.

#### 3.4.1 Stemming

Stemming mentions to detecting the derivation of a definite word. To hand are essentially dual types of stemming techniques, initial one is inflectional and second one is derivational. Derivational stemming can create a novel word from an existing word, sometimes by simply changing grammatical category. The category of stemming continuedable to scheme is called declension reducing. A frequently utilized algorithms is the 'Porter's Algorithm' for stemming. The normalization is restricted to normalizing linguistic variations such as singular/plural or past/present, it is referred to curvature stemming. To minimize the belongings of variation as well as structural disparities of words, attitude has reprocessed respectively discussion utilizing a delivered variability of the Porter stemming algorithm with a few fluctuations concerning the end in which have omitted some cases.

#### 3.4.2 Domain dictionary

Trendy directives to progress tools of this category, it is important to afford them with a data base. A cooperative usual of all the feature terms is the Domain dictionary. The assembly of the Domain dictionary implemented contained of three levels in the hierarchy. Namely, Parent Grouping, Sub-category as well as word. Starting groupings describe the central grouping further down which some sub-category otherwise expression falls. A category will be exceptional on its level in the hierarchy. Additional categories go to



a convinced initial category as well as every subcategory will involve of all the words related with it. A lot of words in a text file can be preserved as undesirable clutter. To eradicate the invented a distinct file adding all related words. These contain disputes such as the, a, an, if, off, on etc.

### 3.4.3 Text Indexing Techniques

Around are frequent common text retrieval indexing techniques, as well as overturned directories as well as signature files. An overturned catalogue is an index structure that preserves binary hash indexed or B+ tree indexed tables: document table and term table, where document board contains of a set of manuscript proceedings, every comprising two fields: doc id and posting list, where posting list is a list of terms otherwise pointers to terms that occur in the document, sorted according to some relevance measure. This involves of a set of duration records, respectively comprising twice in a fields: term id and posting list, where posting list requires a list of manuscript identifiers the term performs. Through an organization, it is informal to response questions like "Novelty all of the forms connected with an assumed set of terms," or "Discovery all of the languages connected with a given set of forms." To invention all of the forms related with a set of terms. First identify the slope of manuscript identifiers in term table on behalf of respectively. Then overlap them to attain the established of relevant documents. Inverted indices are widely utilized in industry. They are informal to device as well as the posting lists could be rather long, manufacture the loading requirement quite large. They are easy to implement, but are not satisfactory at handling synonymy like where two very dissimilar words can require the equivalent denotation as well as polysemy where an separate word might have many meanings. Each signature has a secure size of  $b$  bits representing relations. A humble encrypting scheme goes as follows. Each bit of a manuscript name is modified to 0. A bit is established to 1 if the term it signifies seems in the document. Such multiple to single mappings make the search expensive because a document that matches the signature of a query does not automatically comprise the set of keywords of the query. The document consumes to be recovered, analysed, stemmed, as well as checked. Enhancements be capable to be complete by first

execution occurrence analysis, stemming, as well as by straining stop words, as well as utilizing a hashing technique as well as covered coding technique to encrypt the list of terms into bit representation. However, the problem of multiple to one mappings still consists the major disadvantage of this approach. Researchers can declaration to for supplementary conversation of indexing techniques, containing exactly how to compress an index.

### 3.5 Natural Language Processing

NLP utilizes some level of underlying linguistic representation of text, to formulate sure that the generated text is grammatically correct and fluent. Most NLP systems include a syntactic releaser to ensure that grammatical rules such as subject-verb agreement are observed, as well as text planner to resolve how to assemble stretches, paragraph, as well as other parts coherently. In tokenization, a verdict is segmented into a list of tokens. The token symbolizes a word or a special symbol such an exclamation mark. Morphological otherwise lexical examination is a procedure universally correspondingly appearance is identified finished its quantity of dialogue. The difficulty arises in this regulates, charity for instance, how a sentence is broken down into phrases, and in what way the phrases are broken down into sub-phrases, and all the way down to the actual structure of the words utilized.

**Table 1.1 Comparative Analysis for Text Mining Techniques**

TECHNIQUES	ADVANTAGES	DISADVANTAGES
<i>Classification</i>	<ul style="list-style-type: none"> <li>• Training is very fast.</li> <li>• Easy to understand and implement</li> </ul>	<ul style="list-style-type: none"> <li>• Perform very poorly when features are highly correlated</li> </ul>
<i>Clustering</i>	<ul style="list-style-type: none"> <li>• clustered solution is automatic recovery from failure</li> <li>• recovery without utilizer intervention</li> <li>• No training Data needed</li> </ul>	<ul style="list-style-type: none"> <li>• Clustering are complexity and inability to recover from database corruption.</li> <li>• Not to explicit as supervised classification.</li> </ul>
<i>Information Retrieval</i>	<ul style="list-style-type: none"> <li>• The most practical for indexing and retrieving large</li> </ul>	<ul style="list-style-type: none"> <li>• Low level features are not able to describe and interpret semantically.</li> </ul>

	amount of images. • Textual induction	
Information Extraction	• Non-toxic • Statistically clear	• Unguided analysis • Statistically dependent
Natural Language Processing	• Relieves burden of learning • No Training	• Require more clarification • Unpredictable • May not show context

## 4. TEXT MINING ALGORITHMS

### 4.1 Naive Bayes Classifier

Probabilistic classifiers consume increased an allocation of popularity freshly as well as to complete unusually well. These probabilistic approaches variety expectations about how the data (words in documents) are generated and propose a probabilistic model based on these assumptions. Then utilize a set of training examples to estimate the parameters of the model. Bayes rule is utilized to classify novel examples and select the class that is most likely has generated. The Naive Bayes classifier is perhaps the simplest and the most widely utilized classifier.

### 4.2 Decision Tree classifiers

Decision tree is basically a hierarchical tree of the training instances, in which a complaint on the quality value is utilized to divide the data hierarchically. Respectively node of the tree is a test of around characteristic of the training occurrence, as well as respectively branch descendants since the node resembles to one the value of this aspect. An occurrence is confidential by establishment at the root node, testing the characteristic by this node as well as moving down the tree branch conforming to the value of the characteristic in the specified occasion. For occurrence a node may be segmented to its nonexistence of a particular term in the document. Decision trees have been utilized in combination with boosting techniques.

As soon as decision tree is utilized for text classification it contain tree internal node are label by term, divisions departing from labeled by test on the weight, as well as leaf node are characterize corresponding class labels. Tree be able to categorize the document by consecutively complete the query structure from root to awaiting it scopes a convinced leaf, which characterizes the area for the classification of the document.

### 4.3 Support Vector Machines

Support Vector Machines (SVM) are supervised learning classification algorithms where have been extensively utilized in text classification problems. SVM are a form of Linear Classifiers. The context of text documents are models that manufacture a classification decision is constructed arranged the assessment of the linear arrangements of the documents features. Thus, the output of a linear predictor is defined to be  $y = R_a \cdot R_x + b$ , where  $R_x = (x_1, x_2, \dots, x_n)$  is the normalized document word frequency vector,  $R_a = (a_1, a_2, \dots, a_n)$  is vector of coefficients and  $b$  is a scalar. We can interpret the predictor  $y = R_a \cdot R_x + b$  in the categorical class labels as a separating hyperplane between different classes. A single SVM can only separate two classes, a positive class and a negative class. SVM algorithm attempts to find a hyperplane with the maximum distance from the positive and negative examples. The documents with distance from the hyperplane are called support vectors and specify the actual location of the hyperplane. Unique improvement of the SVM method is that, it is moderately strong to huge dimensionality, for learning is almost autonomous of the dimensionality of the feature space.

### 4.4 k-means Clustering

K-means clustering is one the partitioning algorithms which is widely utilized in the data mining. The k-means clustering partitions  $n$  number of documents in the environment of manuscript data into  $k$  number clusters. Representative around which the clusters are built. The basic form of k-means algorithm is: Finding an optimal solution for k-means clustering is computationally difficult (NP-hard), however, there are efficient heuristics such as that are employed in order to converge rapidly to a local optimum. The main difficulty of k-means gathering is that it is certainly precise searching to the preliminary optimal. Thus, there are some techniques utilized to determine the initial  $k$ , using another lightweight clustering algorithm such as agglomerative clustering algorithm.

### 4.5 Hierarchical algorithms

Hierarchical clustering denotes to an unsupervised learning procedure that regulates consecutive clusters depends on formerly demarcated clusters. The final point discuss to a various set of clusters, where each and every cluster is various from the other type of cluster,



and the objects within each cluster are the same as one another.

There are two different types of hierarchical clustering

- ❖ Agglomerative Hierarchical Clustering
- ❖ Divisive Clustering

#### 4.5.1 Agglomerative hierarchical clustering

Agglomerative clustering is one of the most common types of hierarchical clustering utilized to group similar objects in clusters. Correspondingly data point performance as an individual cluster as well as at each step, data objects are assembled in a bottom-up technique in Agglomerative clustering. Primarily, each data object is in its cluster. At each iteration, the clusters are collective with different clusters until one cluster is formed.

#### 4.5.2 Divisive Hierarchical Clustering

Disruptive hierarchical clustering is accurately the contrasting of Agglomerative Hierarchical clustering. In disruptive Hierarchical clustering, all the data points are considered an individual cluster, and in every iteration, the data points that are not similar are separated from the cluster.

**Table 1.2 Comparison Table of Text Mining Algorithms**

ALGORITHM	PROS	CONS
<i>Naive Bayes Classifier</i>	<ul style="list-style-type: none"> <li>• Work well on numeric textual data</li> <li>• Easy to implement and computation</li> <li>• Easily modified Compare with different algorithm</li> </ul>	<ul style="list-style-type: none"> <li>• Perform very poorly when features are highly correlated</li> </ul>
<i>Decision Tree classifiers</i>	<ul style="list-style-type: none"> <li>• Easy to understand</li> <li>• Easy to generate rule</li> <li>• Reduce problem complexity</li> </ul>	<ul style="list-style-type: none"> <li>• Training time is expensive</li> <li>• A document only connected with one branch</li> <li>• May Suffer from over fitting.</li> </ul>
<i>Support Vector Machines</i>	<ul style="list-style-type: none"> <li>• Work well on numeric or textual data</li> <li>• Easy to implement and computation</li> </ul>	<ul style="list-style-type: none"> <li>• Perform very poorly when features are highly corrected.</li> </ul>

	<ul style="list-style-type: none"> <li>• Work for linear and non linear data</li> <li>• More capable to solve multi-label classification</li> </ul>	
<i>K-Means Clustering</i>	<ul style="list-style-type: none"> <li>• Easy to implement and identify unknown groups of data from complex datasets.</li> <li>• The results are presented in an Easy and simple manner.</li> </ul>	<ul style="list-style-type: none"> <li>• No-optimal set of clusters</li> <li>• Lacks of consistency</li> <li>• Breaks large clusters.</li> <li>• It is sensitive to noise and outliers.</li> </ul>
<i>Hierarchical Algorithms</i>	<ul style="list-style-type: none"> <li>• It is robust and impervious to noise</li> <li>• Better speed and accuracy</li> </ul>	<ul style="list-style-type: none"> <li>• Handles only numerical data</li> </ul>

## 5. CONCLUSION

Text Mining can be defined as a technique which is utilized to extract interesting information or knowledge from the text documents which are usually in the unstructured form. Text Mining is discussed with its various techniques which can be utilized such Classification, Clustering, Summarization and various techniques and methods are discussed for efficient and accurate text mining. In this short survey, compare the notion of text mining techniques have been analysed and algorithms available have been presented. Due to its novelty, there are many potential research areas in the field of Text Mining, which includes finding better intermediate forms for representing the outputs of information extraction, an XML document may be a good choice. Mining texts in different languages is a major problem, since text mining tools should be able to work with many languages and multilingual documents.

### Conflict of interest statement

Authors declare that they do not have any conflict of interest.

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