



---

## International Journal of Intellectual Advancements and Research in Engineering Computations

---

### Conceptual approach to text clustering using wordnet

C.Elanthendral<sup>1</sup>, Dr.R.Malathi MCA, M.Phil, Phd<sup>2</sup>

<sup>1</sup>Research Scholar, Department of Computer Science, H. H. The Rajah's College (Autonomous),  
Pudukkottai – 622 001.

<sup>2</sup>Assistant Professor, Department of Computer Science, H. H. The Rajah's College (Autonomous),  
Pudukkottai – 622 001.

---

#### ABSTRACT

Short messages understanding and short messages are in every case more vague. These short messages are delivered including Search questions, Tags, Keywords, Conversation or Social posts and containing restricted setting. For the most part short content doesn't contain adequate assortment of information to help many best in class approaches for text mining, for example, theme displaying. Short messages are more uncertain and more uproarious, and hard to comprehend in light of the fact that it having more than one importance, which builds the trouble level to deal with them. Semantic examination is significant to all the more likely see short content. For semantic examination conventional strategies are utilized for errands like content division, grammatical form labeling and idea marking. word arrangement is the common language preparing undertaking of distinguishing interpretation connections among the words (or all the more once in a while multiword units) in a bitext, bringing about a bipartite chart between the different sides of the bi text, with a curve between two words if and just in the event that they are interpretations of each other. Word arrangement is regularly done after sentence arrangement has just distinguished sets of sentences that are interpretations of each other. In this work, we understanding the purchaser text by slope climbing calculation for seeing short content we fabricate and utilize a model framework which gives semantic information gave by notable information base and naturally gathered from assortment of composed words.

---

#### INTRODUCTION

Information mining is a cycle of scanning huge information to find designs for basic investigation. Information mining is an innovation to assist organizations with zeroing in on their information stockroom. So it is called as Knowledge Discovery in Data (KDD). KDD choices are permitted by information digging apparatuses for organizations. Information mining apparatuses can respond to business addresses that generally were tedious to

determine. Figure 1.1 shows the information mining measure steps.

#### CONCEPTUAL APPROACH TO TEXT CLUSTERING USING WORDNET

Dissertation submitted to the H.H. The Rajah's College  
(Autonomous B<sup>+</sup>)

## DATA MINING PROCESS

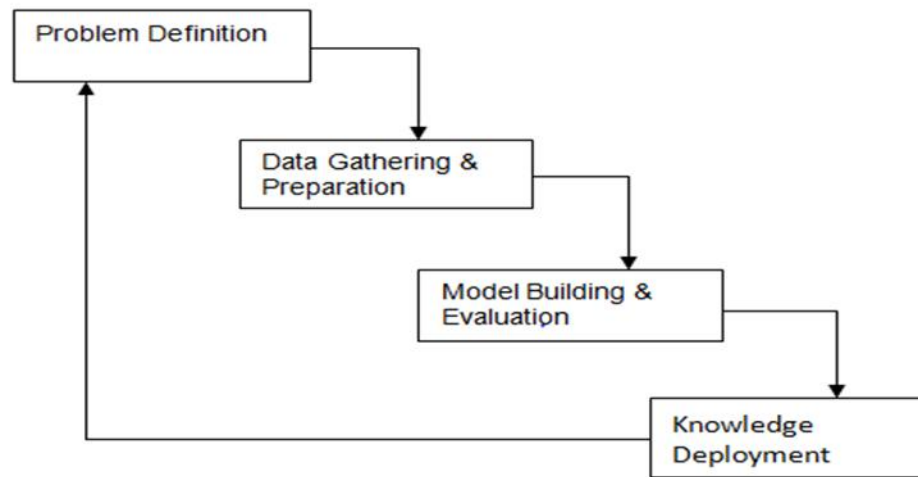


Figure 1.1 Working of Data Mining Process

### Opinion mining

Item surmising mining is a cycle of following the temperament of the general population about a specific item. Sentiments can be basic when it's utilization to settle on a choice or pick among various choice. Data gathering conduct has

consistently been to discover what others think. The accessibility of conclusion rich assets, for example, online survey locales and individual web journals, and difficulties emerge, to comprehend the assessments of others individuals. Figure 1.2 shows the cycle of assessment mining.

### Process of product inference Mining

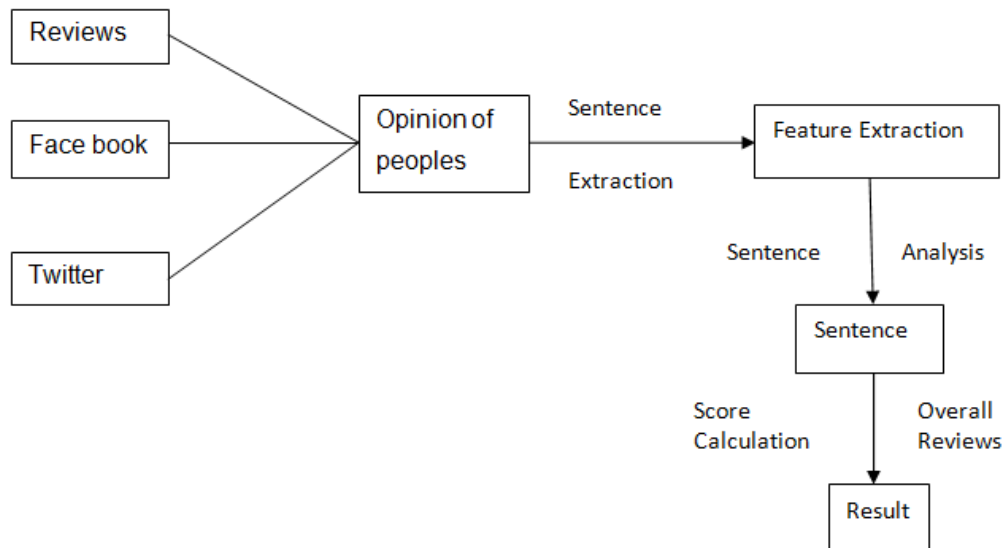


Figure 1.2 Process of opinion mining

## LITERATURE SURVEY

### A library for support vector machines

Chih-Chung Chang, and Chih-Jen Lin LIBSVM is a library for Support Vector Machines (SVMs). client has been effectively building up this bundle since the year 2000. The objective is to push clients to effectively apply SVM to their applications. LIBSVM has increased wide prevalence in AI and numerous different territories. In this article, client presents all usage subtleties of LIBSVM. Issues, for example, taking care of SVM enhancement issues, hypothetical intermingling, multi-class order, likelihood evaluations, and boundary choice are examined in detail great IR (data recovery) is characteristically predicated on clients looking for data, the purported "data need". In any case, the need behind a client search is frequently not instructive - it may be navigational (give me the url of the site I need to reach) or conditional (give me destinations where I can play out a specific exchange, for example shop, download a document, or discover a guide). Clients investigate this scientific categorization of client look and talk about how worldwide web indexes developed to manage client explicit necessities.

SVMs (Support Vector Machines) are a helpful procedure for information arrangement. Despite the fact that SVM is viewed as simpler to use than Neural Network clients inexperienced with it regularly get unsuitable outcomes. Here we diagram a "cookbook" don't move toward which generally gives sensible outcomes. Note that this guide isn't for SVM specialists nor do we promise you will accomplish the most noteworthy exactness. Likewise, we don't expect to tackle testing or troublesome issues. Our motivation is to give SVM fledglings a formula for quickly getting satisfactory outcomes. Despite the fact that clients don't have to comprehend the basic hypothesis behind SVM, we briefly present the nuts and bolts essential for clarifying our methodology. An arrangement task for the most part includes isolating information into preparing and testing sets. Each occurrence in the preparation set contains one "target esteem" (for example the class names) and several "attributes" (for example the highlights or watched factors). The objective of

SVM is to create a model (in view of the preparation information) which predicts the objective estimations of the test information given just the test information qualities.

### Multi-document service usage classification of evaluative text

Present and contrast two methodologies with the undertaking of summing up evaluative contentions. The first is a sentence extraction based methodology while the second is a language age based methodology. client assesses these methodologies in a client study and finds that they quantitatively perform similarly client. Subjectively, However, client find that they perform client diverse yet corresponding reasons. client infers that a powerful technique for summing up evaluative contentions should adequately combine the two methodologies. Archive extremity order represents a huge test to information driven strategies, opposing customary content arrangement procedures (Pang, Lee, and Vaithyanathan, 2002) [1]. Past methodologies zeroed in on choosing demonstrative lexical highlights (e.g., "great"), characterizing a report as per the quantity of such highlights that happen anyplace inside it. Conversely, client propose the accompanying cycle: (1) name the sentences in the record as either abstract or target, disposing of the last mentioned; and afterward (2) apply a standard AI

Classifier to the subsequent concentrate. This can keep the extremity classifier from thinking about unessential or even conceivably deceptive content: For instance, in spite of the fact that the sentence "The hero attempts to secure her great name" contains "great", it discloses to us nothing about the creator's assessment and in actuality could client be installed in a negative film survey. Additionally, as referenced above, subjectivity concentrates can be given to clients as a rundown of the opinion situated substance of the archive. Client results show that the subjectivity removes client makes precisely speak to the estimation data of the beginning records in a considerably more reduced structure: contingent upon decision of downstream extremity classifier. Likewise, client investigate extraction strategies dependent on a base cut detailing, which gives a productive, instinctive, and

compelling methods for incorporating between sentence level logical data with conventional pack o of words highlights. In this work for the substance just runs, in both the impromptu assignment and the section page discovering task, client utilized a data recovery framework dependent on a straightforward unigram language model. In the Ad hoc task client explored different avenues regarding elective ways to deal with smoothing. For the passage page task, client fused extra data into the model. The wellsprings of data client utilized notwithstanding the report's substance are connections, URLs and grapples. Client found that pretty much every methodology can improve the consequences of a substance just run. At long last, an exceptionally fundamental methodology, utilizing the profundity of the way of the URL as an earlier, yielded by a wide margin the biggest improvement over the substance just outcomes passage page looking is not quite the same as broad data looking, not just on the grounds that section pages vary from other client reports, yet in addition on the grounds that the objectives of the assignments are unique. In an overall data search task client keen on finding however much data as could reasonably be expected, while for section page look through client searching for one explicit record. In this way, the passage page task is unmistakably a high accuracy task. In view of both the distinctions in the errand and in the archives, data sources other than the report's substance can be extremely helpful for finding the important section page despite the fact that they didn't do much for general data looking.

### **The anatomy of a large-scale hypertextual user search engine**

**1998 Published by Elsevier Science B.V.**

Client present in hypertext. Google is intended to creep and record the client effectively and produce substantially more fulfilling query items than existing frameworks. The model with a full book and hyperlink information base of at any rate 24 million pages is accessible at <http://l.google.stanford.edu/>To design an internet searcher is a difficult assignment. Web crawlers list tens to countless client pages including a practically identical number of unmistakable terms. They utilizes countless questions each day. Notwithstanding the significance of huge scope

web indexes on the client, next to no scholarly research has been done on them. Besides, because of quick development in innovation and client multiplication, making a client internet searcher today is totally different from three years back. This work gives an inside and out portrayal of our huge scope client web crawler - the principal such point by point open depiction client know about to date [2-4].

Aside from the issues of scaling customary hunt methods to information of this greatness, they are new specialized difficulties associated with utilizing the extra data present in hypertext to create better query items. This places of business this inquiry of how to fabricate a common sense huge scope framework which can abuse the extra data present in hypertext. Likewise client takes a gander at the issue of how to adequately manage uncontrolled hypertext assortments where anybody can distribute anything they need. All rights held.

With the gigantic measures of data being made on the web each moment by a large number of individuals from all around the globe, looking for a specific snippet of data an individual needs is hard if certainly feasible. To help everybody in this assignment, frameworks known as "Web indexes, for example, Google have been made. Nonetheless, notwithstanding the significance of web indexes, there has not been a substantial measure of scholarly exploration done into the region. Google utilizes a generally intricate strategy to record the enormous web proficiently. This technique is known as "slithering", where the framework will continually look and list the web constantly consequently keeping up the most state-of-the-art references. "Since people can just sort or talk a limited sum, and as PCs keep improving, text ordering will scale surprisingly better than it does now" (2000; Brin, Page)For many, Google has a notoriety for being the best web crawler, and is the most ordinarily utilized web internet searcher accessible, being utilized by the vast majority. A huge number of questions are asked and addressed each day [5-8].

## **Comscore reports--authoritative sources in a hyperlinked environment**

**Jon M.Kleinberg**

The system structure of a hyperlinked situation can be a rich wellspring of data about the substance of the earth, if client has viable methods for getting it. client build up a lot of algorithmic apparatuses for separating data from the connection structures of such situations, and report on tests that show their adequacy in an assortment of settings on the World Wide client. The focal issue client address inside our system is the refining of expansive pursuit themes, through the disclosure of "definitive" data sources on such subjects. Client propose and test an algorithmic definition of the thought of power, in view of the connection between client set of significant legitimate pages and the arrangement of "center pages" that combine them in the connection structure. Our plan has associations with the eigenvectors of specific frameworks related with the connection diagram; these associations thusly inspire extra heuristics for interface based investigation [9-10].

Our work starts in the issue of looking on the www, which client could characterize generally as the way toward finding pages that are pertinent to a given inquiry. The nature of a pursuit strategy essentially requires human assessment, because of the subjectivity intrinsic in thoughts, for example, pertinence [11-15].

Client start from the perception that improving the nature of search strategies on the www is, right now, a rich and intriguing issue that is from various perspectives symmetrical to worries of algorithmic productivity and capacity. Specifically, consider that momentum web crawlers ordinarily file a sizable bit of the www and react on the request for seconds. Despite the fact that there would be impressive utility in a pursuit device with a more extended reaction time, given that the outcomes client of essentially more prominent incentive to a client, it has regularly been extremely difficult to state what such an inquiry device ought to register with this extra time. Clearly client are deficient with regards to target works that are both solidly characterized and relate to human ideas of value.

## **A holistic lexicon-based approach to opinion mining**

**Xiaowen Ding**

One of the significant kinds of data on the client is the feelings communicated in the client created content, e.g., client surveys of items, discussion posts, and websites. In this work, User center around client audits of items. Specifically, client study the issue of deciding the semantic directions (positive, negative or impartial) of suppositions communicated on item includes in surveys. This issue has numerous applications, e.g., sentiment mining, Service utilization arrangement and search. Most existing methods use a rundown of supposition (bearing) words (likewise called assessment dictionary) for the reason. Sentiment words will be words that express attractive (e.g., extraordinary, astonishing, and so on.) or bothersome (e.g., awful, poor, and so forth.) states. These methodologies, nonetheless, all have some significant weaknesses.

The client proposes a comprehensive vocabulary based way to deal with tackling the issue by misusing outside confirmations and semantic shows of common language articulations. This methodology permits the framework to deal with sentiment words that are setting subordinate, which cause significant troubles for existing calculations. It likewise manages numerous unique words, expressions and language builds which have impacts on sentiments dependent on their semantic examples. It additionally has a powerful capacity for amassing numerous clashing supposition words in a sentence.

A framework, called Opinion Observer, in view of the proposed strategy has been executed. Exploratory outcomes utilizing a benchmark item audit informational collection and some extra surveys show that the proposed procedure is profoundly viable. It beats existing strategies fundamentally.

A focal precept of old style data recovery is that the client is driven by a data need. Schneider man, Byrd, and Croft characterize data need as "the apparent requirement for data that prompts somebody utilizing a data recovery framework in any case." But the purpose behind a client search is frequently not data, it may be navigational (show

me the url of the site I need to reach) or conditional (give me locales where I can play out a specific exchange, e.g., shop, download a record, or discover a guide). Truth be told as client show later, instructive questions comprise under half of client look.

The principle point of this work is to bring up this distinction and present and dissect scientific categorization of client look. Also, client show how web crawlers developed to manage these client explicit necessities. The rest of the work is sorted out as follows: the exemplary model for data recovery; it presents a scientific categorization of client look; presents a few insights extricated from AltaVista studies and logs with respect to the commonness of different kinds of searches; area 5 investigates the development of web crawlers considering this scientific classification.

### **Problem statement**

In past strategies, mining the assessment relations between conclusion targets and sentiment words was the way to aggregate extraction. To this end, the most embraced methods have been closest neighbor rules and syntactic examples. Closest neighbor rules respect the closest descriptive word/action word to a thing/thing phrase in a restricted window as its modifier. Syntactic data, in which the feeling relations among words are concluded by their reliance relations in the parsing tree.

In the event of the current framework the extortion is distinguished after the misrepresentation is done that is, the misrepresentation is recognized after the grumbling of the Mobile applications audits. Thus, the Mobile applications surveys holder confronted a ton of difficulty before the examination finish.

In existing framework precisely not find the positioning misrepresentation by mining the dynamic time frames, specifically driving meetings, of portable Apps. Such driving meetings can be utilized for distinguishing the neighbourhood abnormality rather than worldwide oddity of audits rankings. Client approves the adequacy of the proposed framework, and show the versatility of the identification calculation.

The identification of the extortion utilization of the Mobile applications is didn't simple to establish. In this framework even, the first Mobile applications holder is additionally checked for extortion identification. Client didn't locate the most precise discovery on misrepresentation applications utilizing this procedure. Low evaluating and arrangement precision. Lackluster showing to order the vindictive applications

### **K means algorithm**

K-implies is a mainstream calculation in archive grouping, which is quick and productive. The disservices of K-implies are that it expects one to set the quantity of bunches first and select the underlying grouping places haphazardly. As Big Data applications go through fast turn of events, it has gotten simpler to store and break down mass datasets. Notwithstanding, individuals could undoubtedly be lost in enormous data created from web journals, BBS and portable terminals consistently. Report bunching is a significant data handling strategy which can consequently sort out huge measure of archives into few important groups and find inactive structure in unlabeled record assortments. Report bunching is frequently utilized in insight examination field to determine the issue of data over-burden. K-implies calculation is one of the divided based bunching calculations, which has been prevalently utilized in such regions as data recovery and customized recommendation. However, in conventional K-implies calculation, introductory grouping communities are chosen arbitrarily. Consequently, the bunch results are excessively reliant on the underlying grouping places, particularly when archives are spoken to with a sack of-words (BOW) model. When utilizing crude terms as highlights, archives are frequently spoken to as high-dimensional and inadequate vectors a couple thousand measurements and a sparsity of 95% to 99% is common.

## **RESEARCH METHODOLOGY**

In proposed framework, User present A Novel Hill Climbing utilizing Hill climbing calculation which doesn't need misrepresentation marks but can distinguish cheats by considering a Mobile

applications holder's way of managing money. Versatile applications exchange handling succession by the stochastic cycle of a slope climbing calculation with Word arrangement model.

Slope Climbing is that pair of goal and emotional choice factors are unequivocally utilized to encode the transaction subjects and discriminative force user for the words. The first Hill Climbing model is created as a method of investigating purchaser audits and records, its expansions have been proposed and effectively applied for some different modalities of information.

The given information is perhaps of any methodology, for example, messages or pictures, while it tends to be treated as an assortment of records. SUBJECT insightful and TOPIC astute Opinion examination is likewise possible. Method to induce ideas from a lot of cases, or a lot of properties is represented. The issue is to distinguish competitor ideas positioned by their probability when watch a lot of examples, or a lot of traits, or a lot of terms of obscure kinds. Gullible bayes model is utilized to assess the likelihood of ideas. What's more, the idea with the biggest back likelihood is positioned as the most conceivable idea to depict the watched cases. Same is utilized for conceptualizing traits and ideas. The surmising of connections among qualities and an idea ought to be intermediated through the occasions of the idea also. In this manner, Hill Climbing Rules rule is applied to determine the probability of ideas. Contrasted and customary dormant semantic investigation and point displaying, for example, Hill Climbing, express semantic examination has the upside of giving semantics that are interpretable by people. Likewise the utilization of knowledgebase, Probase, which is rich with a great many ideas and cases has improved exactness a ton in grouping based applications.

## EXPERIMENTAL RESULTS

### Datasets and evaluation metrics

We select three datasets to assess our methodology. The first dataset is the Customer

Review Datasets (CRD), which incorporates English audits of five items. CRD was likewise utilized. The second dataset is COAE 2008 dataset<sup>26</sup>, which contains Chinese surveys of four sorts of items: cameras, vehicles, workstations and telephones. The third dataset is Large, which incorporates three corpora with various dialects from three spaces including lodgings, mp3s and eateries. For every area in Large, we arbitrarily creep 6,000 sentences. Furthermore, the feeling targets and assessment words in Large were physically commented on as the best quality level for assessments. Three annotators are associated with the comment cycle. Two annotators were needed to judge whether each thing/thing phrase (modifiers/action words) is a supposition target (assessment word) or not. In the event that a contention happened, a third annotator makes a judgment for the conclusive outcomes. The between arrangement was 0.72 for conclusion target comment and 0.75 for supposition word comment. Factual data of each dataset is appeared in Table 2, where #OW and #OT represent the quantities of explained sentiment words and conclusion targets, individually.

In the trials, audits are initial divided into sentences as per accentuation. Next, sentences are tokenized, with grammatical form labeled utilizing the Stanford NLP tool<sup>7</sup>. We at that point utilize the Minipar toolbox to parse English sentences and the Stanford Parsing instrument to parse Chinese sentences. The strategy in is utilized to distinguish thing phrases. We select accuracy (P), review (R) and F-measure (F) as the assessment measurements.

## EXPERIMENTAL RESULTS

### Our Methods vs. State-of-the-art Methods

For comparison, we select the following methods as baselines.

**WAM** is the method described. It used nearest neighbor rules to identify opinion relations among words. Opinion targets and opinion words are then extracted iteratively using a bootstrapping process.

Cluster Document

### DOCUMENT CLUSTERING

Proposed K-Means Accuracy Normalized MI

Cluster No.	Files
Cluster-1	acq0.txt
Cluster-2	acq10.txt
Cluster-3	acq11.txt
Cluster-4	acq4.txt
Cluster-5	corn310.txt,corn322.txt,corn54.txt
Cluster-6	corn488.txt,corn846.txt
Cluster-7	corn51.txt
Cluster-8	crude95.txt
Cluster-9	earn35.txt,earn73.txt
Cluster-10	trade10.txt

Cluster Document

### DOCUMENT CLUSTERING

Proposed K-Means Accuracy Normalized MI

Cluster No.	Files
C0	[crude95.txt]
C1	[earn35.txt]
C2	[acq11.txt]
C3	[trade10.txt, earn73.txt]
C4	[corn310.txt]
C5	[corn322.txt]
C6	[corn488.txt]
C7	[corn51.txt, acq10.txt, acq4.txt]
C8	[corn54.txt]
C9	[corn846.txt, acq0.txt]

DOCUMENT CLUSTERING	
Proposed   K-Means   Accuracy   Normalized MI	
No of Documents	14
No of Clusters	10
K-Means	13.207377650083664
Proposed	18.494174789956798
K-Means < Proposed	

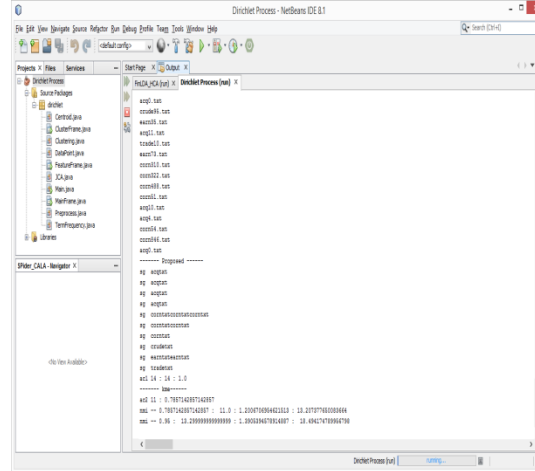
**Hill Climbing** is the method proposed. They designed several syntax-based patterns to capture opinion relations in sentences, and used a NB

algorithm to extract opinion targets and opinion words.

DOCUMENT CLUSTERING	
Proposed   K-Means   Accuracy   Normalized MI	
No of Documents	14
No of Clusters	10
K-Means	78.57142857142857
Proposed	95.0
K-Means < CPI	

**The method proposed.** It is an extension of DP. Besides the syntactic patterns used in DP, Zhang designed some heuristic patterns to indicate

opinion target candidates. An HITS algorithm combined with candidate frequency is then employed to extract opinion targets.



Our WAM uses an unsupervised word alignment model to mine the associations between words. A standard random walk based algorithm, described in Eq.6, is used to estimate the candidate confidences for each candidate. Subsequently, candidates with high confidence will be extracted as opinion targets/words.

$$C_t^{k+1} = (1 - \mu) * M_{t0} * C_o^k + \mu * I_t \quad (6)$$

$$C_o^{k+1} = (1 - \mu) * M_{t0}^T * C_t^k + \mu * I_o \quad (6)$$

**OursPSWAM** is the technique portrayed in this paper. It utilizes a somewhat regulated word arrangement model (PSWAM) to mine the supposition relations between words. Next, a diagram based co-positioning calculation (Eq.7) is utilized to remove feeling targets and supposition words.

## CONCLUSION

Solo theme model named as WAM is proposed to find the words having discriminative capacity to convey either a goal or an emotional sense concerning their appointed points. The WAM model can acquire the BoDW portrayals for reports, and each record is invested with two diverse BoDW portrayals as far as goal and emotional faculties, separately. The outcomes got on a few tests recommend that:

1. TheBoDW portrayal is more prescient than the conventional BoT portrayal for discriminative assignments;

2. WAM helps the presentation of point displaying through the joint revelation of inactive semantic structure of the entire dataset and the diverse goal and abstract separation among the words;
3. WAM has lower computational multifaceted nature than WAM, particularly under an expanding number of subjects;
4. the recognized discriminative words or visual words are helpful in point exhibit just as goal and nostalgic district limitation.

Unaided point model named as Hill Climbing is proposed to find the words having discriminative capacity to convey either a goal or an abstract sense. The BoDW portrayal is more prescient than the conventional BoT portrayal for discriminative tasks.HM Learning has lower computational multifaceted nature than dos LDA, particularly under an expanding number of subjects. With less calculation time additionally high in precise outcomes.

## FUTURE WORKS

The proposed approach of consolidating the neural system with Ensemble Process shows its predominance in quality measures, yet additionally in preparing time. This shows include decrease is a basic issue for learning strategies in notion grouping. Our trial examination shows that a half breed mix of Hill Climbing with word arrangement model continues as Hill moving with WAM Approach could be a superior answer for decreasing the preparation time and expanding the order execution. Our investigation likewise shows

that the compound blend of unigram, bigram and trigram performs better for practically all the expectation models.

The conceivable purpose behind the better presentation of PNNs is a direct result of the joined impact of the computational capacity and adaptability, by holding its straightforwardness.

The forecast exactness of the gathering technique can in any case be expanded by expanding the quantity of classifier blends. To test the restrictions of the proposed strategy, future works could utilize distinctive information spaces and characterization approaches presumably with an informational collection of much a bigger number of surveys.

## REFERENCES

- [1]. D. M. Blei, L. Carin and D. Dunson, "Probabilistic topic models", *IEEE Signal Process. Mag.*, 27(6), 2010, 55-65.
- [2]. Z. Chen, A. Mukherjee, B. Liu, M. Hsu, M. Castellanos, R. Ghosh, "Leveraging multi-domain prior knowledge in topic models", *Proc. 23th Int. Joint Conf. Artif. Intell.*, 2011, 2071-2077.
- [3]. S. Yang, S. P. Crain, H. Zha, "Bridging the language gap: Topic adaptation for documents with different technicality", *Proc. 14th Int. Conf. Artif. Intell. Statist.*, 2011, 823-831.
- [4]. B. Lu, M. Ott, C. Cardie, B. K. Tsou, "Multi-aspect sentiment analysis with topic models", *Proc. Int. Conf. Data Mining Workshops*, 81-88.
- [5]. C. Lin, Y. He, R. Everson, S. Ruger, "Weakly supervised joint sentiment-topic detection from text", *IEEE Trans. Knowl. Data Eng.*, vol. 24, no. 6, pp. 1134-1145.
- [6]. D. Joshi et al., "Aesthetics and emotions in images", *IEEE Signal Process. Mag.*, 28(5), 2013, 94-115.
- [7]. P. Isola, J. Xiao, A. Torralba, A. Oliva, "What makes an image memorable?", *Proc. IEEE Conf. Comput. Vis. Pattern Recognit.*, 2013, 145-152.
- [8]. D. Borth, R. Ji, T. Chen, T. Breuel, S.-F. Chang, "Large-scale visual sentiment ontology and detectors using adjective noun pairs", *Proc. 21st ACM Int. Conf. Multimedia*, 2013, 223-232.
- [9]. D. Putthividhy, H. T. Attias, S. S. Nagarajan, "Topic regression multi-modal latent Dirichlet allocation for image annotation", *Proc. IEEE Conf. Comput. Vis. Pattern Recognit.*, 2014, 3408-3415.
- [10]. R. Liao, J. Zhu, Z. Qin, "Nonparametric Bayesian upstream supervised multi-modal topic models", *Proc. 7th ACM Int. Conf. Web Search Data Mining*, 2014, 493-502.
- [11]. Y. Jia, M. Salzmann, T. Darrell, "Learning cross-modality similarity for multinomial data", *Proc. 13th IEEE Int. Conf. Comput. Vis.*, 2014, 2407-2414.
- [12]. Y. Zhuang, Y. Wang, F. Wu, Y. Zhang, W. Lu, "Supervised coupled dictionary learning with group structures for multi-modal retrieval", *Proc. 27th AAAI Conf. Artif. Intell.*, 2015, 1070-1076.
- [13]. F. Wu, X. Lu, Z. Zhang, S. Yan, Y. Rui, Y. Zhuang, "Cross-media semantic representation via bi-directional learning to rank", *Proc. 21st ACM Int. Conf. Multimedia*, 2015, 877-886.
- [14]. N. Srivastava, R. Salakhutdinov, "Multimodal learning with deep Boltzmann machines", *J. Mach. Learn. Res.*, 15, 2016, 2949-2980.
- [15]. Q. You, J. Luo, H. Jin, J. Yang, "Robust image sentiment analysis using progressively trained and domain transferred deep networks", *Proc. 29th AAAI Conf. Artif. Intell.*, 2016, 381-388.