

Sentiment Analysis of COVID-19 Tweets using Support Vector Machine with Information Retrieval

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Abstract- Coronavirus at first known as Covid Problem of 2019, has been communicated as a pandemic by World Thriving Connection (WHO) on eleventh Walk 2020. Magnificent tensions have mounted on every country to make convincing necessities for controlling everyone by evaluating the cases and fittingly using accessible assets. The quick number of outstanding cases all over has changed into the trepidation of disturbance, dread and nervousness among individuals. The psychological and real suf iciency of the general individuals is viewed as plainly relative with this pandemic sickness. The persistent circumstance has revealed in excess of 24 million individuals being endeavored positive for the most part talking as of 27th August, 2020. In this manner, it's the need basic to do various measures to safeguard the nations by demystifying the relevant genuine elements and data. This paper means to draw out the way that tweets containing all handles related with Coronavirus and WHO have been vain in planning individuals around this pandemic episode appropriately. This study appraisals two sorts of tweets assembled during the pandemic times. In one case, around 23 thousand most retweeted tweets inside the time span from Ist Jan 2019 to 23 rd Walk 2020 have been dismantled and acumen says that the best number of the tweets depicts fair or skeptical feelings. Obviously, a dataset containing 226668 tweets collected inside the period of time between December 2019 and May 2020 have been dissected which contrastingly show that there were a greatest number of positive and fair tweets tweeted by netizens. That is the very thing that the evaluation shows in any case individuals have tweeted generally certain disturbing Coronavirus, yet netizens were involved enchanted in re-tweeting the cynical tweets and that no strong words could be found in WordCloud or assessments incorporating word rehash in tweets. The cases have been embraced through a proposed model with tolerable accuracy work on bv 7.8%.

Key Terms—WHO, Covid-19, Tweets, Accuracy.

I. INTRODUCTION

SARS-CoV-2 infection normally known as Coronavirus has raised a ruckus around town world like never known and turned into a worldwide danger. Schooling is the most fundamental and a significant instrument to work on one's life. As the world wellbeing association (WHO) has proclaimed Coronavirus as a pandemic, it brought about close to add up to conclusion of schools, colleges and universities around the world. These terminations have impacted understudies, educators, staff and, their families yet in addition have an extensive monetary and social results [1]. In such an unmistakable time, as the world attempts to recuperate and adapt, pretty much every instructive association has moved the training system to remote working and virtual learning. Through web-based classes, utilizing innovation understudies and instructors have been attempting to proceed with the training through different practices as zoom

gatherings, sharing web-based materials, recording addresses, power point instructional exercises, etc.

In present days, a large portion of individuals are communicating their sentiments, feelings, and sharing their encounters, utilizing the Web and the informal organizations. This typically prompts impart huge measure of information utilizing the Web. Yet, a large portion of these information are helpful when examined; for instance, most modern organizations and political races depend on knowing the assessments of individuals through correspondence locales and see whether they are positive, negative, or impartial.



Figure 1: Sentiment analysis process steps



The SA has arisen on account of the gigantic data trade on the Web. The SA thought was first proposed by Nasukawa [1]. Right off the bat, the SA is utilized for regular language process (NLP) [2], which dissects conclusions, sentiments, responses of individuals and authors on the Web through interpersonal interaction destinations and business locales about the numerous items and administrations. Feeling investigation is a wide field for some specialists and can likewise be called assessment mining; since it assists with grouping thoughts and conclusions as good, pessimistic, or impartial. SA is a text based study, which is generally involved on surveys and reviews in the Web and virtual entertainment. It handles reactions and client input on business locales to know their acknowledgment or dismissal of an item; this assists with working on the deals of the organization as it tells the decision of a client. With the blast of various suppositions through person-to-person communication locales, novel thoughts were created by frameworks, legislators, clinicians, producers, and specialists to break down them to carry out the best choices. Opinion examination has high productivity utilizing NLP, as measurements, and AI ways to deal with separate and characterize feeling content in a text unit.

II. BACKGROUND

Covids are a social event of related RNA contaminations that cause diseases in warm-blooded creatures and padded animals. In individuals, these diseases cause respiratory plot tainting that can go from smooth to dangerous. Smooth sicknesses consolidate a couple of cases of the fundamental cold (which is furthermore achieved by various diseases, predominantly rhinoviruses), while logically destructive groupings can cause SARS, MERS, and Coronavirus. Secondary effects in various species change: in chickens, they cause an upper respiratory plot disease, while in dairy creatures and pigs they cause free entrails. Antibodies or antiviral meds to thwart or treat human Covid infections are not found at this point. Covid spreads from people to people in a few habits. It creates respiratory issues and causes breathing issues. It has a low casualty rate contrasted with SARS or MERS [1]. In any case, as there is no antibody accessible and because of the idea of transmission and spread of infection, nations all over the planet accepted lockdown and seclusion as the main preventive advances. Thus individuals' development being confined they invested a lot of energy in home or spot of stay. This makes an optimal situation for individuals to communicate their perspectives on interpersonal interaction locales including Twitter. Like in different regions of the planet individuals of India additionally express their perspectives about Coronavirus on twitter. In this paper, those tweets are utilized to examine the way of behaving and feeling of individuals from December 2019 to May 2020. Individuals were extremely negative about Coronavirus in the good 'ol days. Many were not sure to win the battle against Coronavirus. Be that as it may, as the Lockdown occurred, individuals became hopeful about it. Positive tweets are colossally high in the sum in the long stretch of April and May. This work gives new bits of knowledge on Coronavirus and individuals' contemplations about it. Online entertainment is the present method for understanding individuals. There is a lot of papers showed up in the writing since the flare-up makes nations go in Lockdown state. (Tanmay Vijay; Ayan Chawla; Balan Dhanka; Purnendu Karmakar; 2020)

Web-based entertainment is where clients introduce themselves to the world, uncovering individual subtleties and bits of knowledge into their lives. We are starting to comprehend how a portion of this data can be used to work on the clients' encounters with interfaces and with each other. In this paper, we are keen on the character of clients. Character has been demonstrated to be pertinent to many sorts of associations, it has been demonstrated to be valuable in anticipating position fulfillment, expert and close connection achievement, and even inclination for various points of interaction. Up to this point, to precisely check clients' characters, they expected to take a character test. This made it illogical to involve character examination in numerous web-based entertainment areas. In this paper, we present a system by which a client's personality can be



definitively expected through the unreservedly open information on their Twitter profile. We will depict the sort of information gathered, our strategies for examination, and the AI procedures that permit us to anticipate character effectively. We then, at that point, examine the ramifications this has for virtual entertainment plan, interface plan, and more extensive areas. (Jennifer Golbeck; Cristina Robles; Michon Edmondson; Karen Turner; 2011)

For distinguishing mental area of interest subjects, a simple spotlight on bibliometric information experiences a distribution delay. To defeat this issue, we present Twitter mining of progressing on the web correspondence among researchers the for identification of mental examination subjects. In particular, we gathered the whole 69,963 tweets posted between August 2007 and July 2020 from 139 records of brain science teachers, divisions, and exploration organizations from the German-talking nations, as well as areas of the German Mental Society (DGPs). To analyze whether Twitter points are areas of interest as far as demonstrating future distribution patterns, 346,361 references in the PSYNDEX data set were extricated. For deciding the extra worth of our methodology as opposed to conventional meeting investigation, we accumulated all suitable gathering projects of the DGPs and its areas starting around 2010 and thought about dates of subject development. Results uncovered 21 points resolving cultural issues (e.g., Coronavirus), technique (e.g., AI), logical examination (e.g., replication emergency), and various areas of mental exploration. Ten subjects demonstrated a rising distribution pattern, especially themes connected with procedure or logical straightforwardness. Seven Twitter subjects arose before on Twitter than at meetings. A sum of four subjects could be anticipated neither by bibliometric estimating nor gathering contents: "strategic issues in meta-examinations", "energy", "preregistration", and "portable cerebrum/body imaging". Taken together, Twitter mining is a beneficial undertaking for distinguishing mental area of interest subjects, particularly in regards to cultural issues, novel exploration techniques, and examination straightforwardness in brain research. To get the most extensive image of exploration areas of interest, Twitter mining is prescribed notwithstanding bibliometric examinations of distribution patterns and observing of gathering subjects. (Bittermann, André Batzdorfer, Veronika Müller, Sarah Marie Steinmetz, Holger; 2021)

With an ever increasing number of individuals coming on the web, virtual entertainment is turning into a mechanism for assessment sharing. On 18 September 2016, security powers were gone after by a gathering of four psychological oppressors. In this paper, we concentrate on feelings and endurance of tweets post-dread assault by extricating tweets from Twitter. Factors like last retweet, number of retweets, number of top picks are utilized to concentrate on data stream of information posted on Twitter. Higher the quantity of retweets, higher is the range. The occasion caused inescapable response via online entertainment. We talk about our outcomes on feelings alongside the endurance of tweets. (Pulkit Garg; Himanshu Garg; Virender Ranga; 2017)

Coronavirus Affliction or Covid is one more disease ailment that began in 2019 (Wang et al., 2020). The contamination has now spread across the world and the basically all of the countries are connecting with against this disease and are putting forth a fair attempt to actually look at the spread whatever amount as could be anticipated. The World Prosperity Affiliation has articulated it as a Pandemic (World Prosperity Affiliation, 2020) and is researching each likelihood to control the pandemic and is expecting an inoculation to fix it (El Zowalaty and Järhult, 2020). There are moderately not many educational assessments (with the exception of a couple for instance Boldog et al., 2020; Goval et al., 2020; Bhat et al., 2020) that can guide researchers to focus on the impact this pandemic has on the close to home prosperity of people and besides on the economies of countries all over the planet.

By the essential multi day stretch of Walk 2020, a couple of countries like China, Italy, Spain, and Australia were fighting with the COVID19 pandemic by taking serious measures like crosscountry lockdown or by cordoning off the areas that were related with having risks of neighborhood. Following the new accomplices, the public power of India endeavored a huge decision of crosscountry



lockdown on Spring 25th for 21days from Spring 26th to April fourteenth, 2020 (English Telecom Venture, 2020). India, with a general population of 1.3 Billion people, was at a high bet of encountering irreversible mischief, and serious measures should "even everything out." The Top state head of India pronounced the lockdown (Covid, 2020), yet it didn't come as a shock since Indians were truly given an energy of what it had in store through a one-day check in time named as "Janata Really look at in time" of 14 h on Spring 22nd from 7 A.M. to 9 P.M. (The Monetary Times, 2020). Subsequently, Indians were introduced to a lockdown situation somewhat, and this supported preparing mentally for the crosscountry lockdown, and the statement didn't come as a shocker to them. Looking at the estimations of COVID19 polluted, recovered, and end cases of Italy and various countries, Indians understand that drastic actions were expected in India to keep the numbers from rising emphatically. (Gopalkrishna Barkur, Vibha, and Giridhar B. Kamath; 2020)

The new Coronavirus infection (Covid) pandemic is world's adversely influencing the clinical consideration structure as well as the social, money related, and mental success of mankind. Individuals, affiliations, and governing bodies are using electronic amusement to talk with each other on different issues associating with the Covid pandemic. Not much is acknowledged about the subjects being shared by means of virtual diversion stages interfacing with Covid. Exploring such information can help methodology makers and prosperity with caring affiliations assess the necessities of their accomplices and address them reasonably. This study hopes to perceive the chief focuses posted by Twitter clients associated with the Covid pandemic. Using a lot of gadgets (Twitter's chase application programming purpose in cooperation (Programming connection point), Tweepy Python library, and PostgreSQL informational index) and using a lot of predefined search terms ("crown," "2019-nCov," and "Covid"), we isolated the text and metadata (number of inclinations and retweets, and client profile information including the amount of enthusiasts) of public English language tweets from February 2, 2020, to Walk 15, 2020. We analyzed the assembled

tweets using word frequencies of single (unigrams) and twofold words (bigrams). We used lethargic Dirichlet assignment for subject exhibiting to recognize focuses analyzed in the tweets. We in like manner performed assessment examination and isolated the mean number of retweets, inclinations, and enthusiasts for each subject and decided the affiliation rate per point. Out of around 2.8 million tweets included. 167.073 novel tweets from 160.829 excellent clients met the consolidation rules. Our examination perceived 12 subjects, which were gathered into four head points: start of the disease; its sources; its impact on people, countries, and the economy; and ways to deal with directing the bet of pollution. The mean assessment was positive for 10 subjects and negative for 2 places (passings achieved by Covid and extended bias). The mean for tweet subjects of record enthusiasts went from 2722 (extended bias) to 13,413 (financial incidents). The most imperative mean of inclinations for the tweets was 15.4 (monetary incident), while the least was 3.94 (travel blacklists and alarms). General prosperity crisis response practices on the ground and online are ending up being logically simultaneous and joined. Online diversion allows an opportunity to grant prosperity information to the public directly. Prosperity systems should work on building public and overall disease area and perception structures through actually taking a look at virtual diversion. There is in like manner a necessity for a more proactive and swift general prosperity presence by means of online diversion to fight the spread of fake news. (Alaa Abd-Alrazaq, Dari Alhuwail, Mowafa Househ, Mounir Hamdi, Zubair Shah; 2020)

III. PROBLEM IDENTIFICATION

In [24] tweets feeling dissemination were dissected for distinguishing the last suitability of any message, by turn around tree method. Here message dispersion of re-tweet was construct together. In this work advancement of opposite tree is perplexing and time taken, which lead to diminish precision when multi class opinion were dissected.

In [25] three class feeling were distinguished utilizing Bayesian classifier where administered information was required first. Here feeling of expression were relies upon some edge for arrangement. Subsequently



this work need outer asset before feeling distinguishing proof.

In [26] highlight decrease was finished for the upgrade of AI where hereditary calculation was carrying out for include choice. Here this step of learning can be additionally improved by utilizing some other characterized geo-motivated calculations.

IV. RESEARCH OBJECTIVES

So following are level headed of the proposed work:

• Design Dictionary were produce for the feeling content grouping.

• Model can acknowledge text content in any organization.

• Foster model which take no manual association for feeling recognizable proof.

• Streamline the learning model by decreasing the component vector.

V. PROPOSED METHODOLOGY

The algorithm of the proposed work is as follows. This method works under four phases. The proposed strategy works under the accompanying advances A. Preprocessing

Preprocessing is a cycle utilized for change of tweets into include vector. Very much like text orders the preprocessing additionally has discussion about its division. This work uses text preprocessing which comprise of words answerable for bringing down the exhibition of learning models. Information preprocessing decreases the size of the info text contents altogether. It includes exercises like sentence limit assurance, regular language-explicit stop word disposal and stemming. The accompanying advances have been act in preprocessing stage.

- 1. Secure the dataset.
- 2. Import every one of the pivotal libraries.
- 3. Import the dataset.

4. Recognizing and taking care of the missing qualities.

5. Encoding the absolute information.

- 6. Parting the dataset.
- 7. Include scaling.

B. Designs

To foster improved answer for characterization of content example based highlight extraction of catchphrase will give promising outcomes. Here this can be comprehend as 'software engineering', are watchwords while 'software engineering' is design in the article. So gathering of at least two words in the substance which rehashed present in other piece of content is considers as example.

C. Highlight Decrease

To perform highlight decrease dynamic geopropelled calculation is apply in this step where decrease of elements were check. Subsequently with the assistance of this step work will distinguish some of examples/catchphrases as a feeling delegate which further bunch other arrangement of content specifically class of opinion.

D. Preparing List of capabilities

According to the last refreshed populace of the bunch community meeting. Proposed work can utilize these meeting just for preparing the brain organization. Here this increment the learning limit of the work. As additional examples from same class increment the disarray of the framework. This can be says as little info learning group preparing information which further develop opinion location pace of the proposed work.

E. Preparing of SVM

To proficiently distinguish the opinion of the info tweet content proposed model use SVM (Backing Vector Machine) for the preparation as the finding of a class is conceivable by utilizing these organizations. Based on this information separator constants were found. The element vector is gathered during the component assortment steps of the various kinds of class which is coordinated, in the model.

VI. RESULTS AND ANALYSIS

The proposed methodology was implemented in MATLAB software. For this purpose, MATLAB R2021a was used. The machine learning toolkit was used to provide essential functions. The proposed model was evaluated by implementing it in MATLAB, and the efficiency of the algorithms was analyzed.



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Figure 2: MATLAB Setup for proposed work

In above figure 5.1, shows that the generalize code of sentiment analysis model in which use the concept of Text Mining and SVM (Support Vector Machine).

The following observations are collect during process of proposed model on patient dataset. Accuracy, Precision and F1-Score parameters are calculate as follows:

Table 1: Estimation of Accuracy in among of SVM[1], ANN [2] and Proposed Prediction Model

	SVM	ANN	Proposed Model
Import	[1]	[2]	
Data			
200	0.4	0.38	0.51
400	0.53	0.48	0.57
600	0.49	0.44	0.53
800	0.57	0.51	0.61
1000	0.51	0.48	0.55



Figure 3: Graphical Analysis of Accuracy in among of SVM [1], ANN [2] and Proposed Prediction Model The above graph show that the proposed model gives better prediction accuracy as compare than SVM[1] and ANN[2]. When sample data size is 200 then accuracy improve by 27.5%. In a similar way, when sample data is 1000 then accuracy improve by 7.8%.

Table 2: Estimation of Precision in among of SVM[1], ANN [2] and Proposed Prediction Model

	SVM	ANN	Proposed
Import	[1]	[2]	Model
Data			
200	0.41	0.37	0.48
400	0.52	0.47	0.56
600	0.48	0.42	0.52
800	0.56	0.52	0.6
1000	0.5	0.44	0.54



Figure 4: Graphical Analysis of Precision in among of SVM [1], ANN [2] and Proposed Prediction Model

The above graph show that the proposed model gives better prediction precision as compare than SVM[1] and ANN[2]. When sample data size is 200 then precision improve by 17%. In a similar way, when sample data is 1000 then accuracy precision by 8%.

Table 3: Estimation of F1-Score in among of SVM [1], ANN [2] and Proposed Prediction Model

Import	SVM	ANN	SVM-GWO
Data	[1]	[2]	(Proposed)
200	0.4	0.34	0.46
400	0.57	0.52	0.59
600	0.53	0.47	0.56



800	0.58	0.52	0.61
1000	0.52	0.46	0.53



Figure 5: Graphical Analysis of F1-Score in among of SVM [1], ANN [2] and Proposed Prediction Model

The above graph show that the proposed model gives better prediction F1 score as compare than SVM[1] and ANN[2]. When sample data size is 200 then F1 score improve by 15%. In a similar way, when sample data is 1000 then F1 score improve by 2%.

VII. CONCLUSION

Proposed work will expand the feeling ID productivity of the work in all unique assessment boundaries. Entire model perform pre-handling by word references, than bring designs/watchwords from pre-handled information. Precision of learning model improve by decrease of info highlight set where geomotivated calculation give great arrangement of vectors. So it is normal that work will proposed a model which recognize tweet content feeling where content not need any organization and execution season of calculation was likewise exceptionally stopped low.

The finishes of this proposition work are as per the following:

1. The proposed model gives preferred forecast exactness as look at over SVM[1] and ANN[2]. At the point when test information is 1000 then exactness work on by 7.8%.

2. The proposed model gives preferred forecast accuracy as think about over SVM[1] and ANN[2].

At the point when test information is 1000 then exactness accuracy by 8%.

3. The proposed model gives better expectation F1 score as think about than SVM[1] and ANN[2]. At the point when test information is 1000 then F1 score work on by 2%.

Consequently, nostalgic examination of tweets according to Coronavirus sickness side effects are better arranged through proposed strategy.

VIII. SUGGESTIONS FOR FUTURE WORK

Our proposed system assists with working on the precision of Coronavirus tweets nostalgic investigation and enormously accommodating for additional treatment. In ongoing upgrades, the exactness must be tried with various dataset and to apply other simulated intelligence calculations to really take a look at the precision assessment. The constraint of the proposed model is handling time, as a result of enormous measure of information taken for assessing the exhibition of train information. In future, similar calculations to be carried out with constant information for assessing the viability of the framework.

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