

Journal of Advanced Zoology

ISSN: 0253-7214 Volume 44 Issue S-6 Year 2023 Page 537:545

A Novel Method for Fruit Detection and Calorie Estimation using CNN

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Article History	Abstract
Received: 06 June 2023 Revised: 05 Sept 2023 Accepted: 29 Nov 2023	Dietary food consumption has become significant these days as the patients need to deal with food admission without fail. Picture-based organic product calorie assessment is critical to different versatile applications for recording ordinary feast. In any case, some of them would need manual support for calories assessment, and regardless of whether it is computerized, organic product classifications are frequently restricted or pictures from numerous perspectives are required. It isn't yet accomplished to gauge organic product calorie with functional precision and assessing natural product calories from an organic product photograph is a perplexing issue. Along these lines, in this paper, we propose assessing natural product calorie from an organic product photograph by synchronous learning of organic product pictures and calories
CC License	utilizing profound learning. We present a framework which can perceive the organic product picture, and afterward foresee its dietary substance, like calories. We would present CNN based ways to deal with these issues, with favourable primer outcomes.
CC-BY-NC-SA 4.0	Keywords: image processing, deep learning, CNN, fruit, Diabetes, calories

1. Introduction

As of late, see able of an ascent in wellbeing thinking on eating, numerous versatile applications for recording regular suppers are delivered up until now. Likewise, with simple access of Internet, food is conveyed at entryway step just by a tick of a catch due to which individuals have begun burning-through higher measure of cheap food [1]. Due to this, the predominance and weight of heftiness has found out disturbing levels [2]. A number of them utilize organic product picture acknowledgment which may recognize natural product names also as gauge organic product calories. In any case, since these applications frequently expect clients to enter data, as an example, organic product classifications and size or volume, there are issues that it's problematic and emotional assessment. To tackle these issues, programmed acknowledgment of the natural product photograph on the cell phones is successful [5]. In an exceedingly large portion of the cases, the assessed calories are simply connected with the assessed natural product classifications, or the size contrasted with the quality size of every organic product class which is generally shown by a client physically. Presently, no applications which may gauge organic product calories naturally exist. Albeit the overwhelming majority of the image acknowledgment errands including natural product class acknowledgment are nearly addressed due to extraordinary advancement of CNN-based picture acknowledgment techniques, completely programmed organic product calorie assessment from a natural product photograph has still stayed an inexplicable issue. We expect that the fruit calorie estimation will not only help people's health in plenty but is also favourable as a replacement problem of picture identification studies. Regarding fruit calories estimation, lots of perspectives are proposed to date. The principle approach would be to assess calories visible of the assessed natural product class, which could be a very standard methodology. Since natural product calories firmly depend upon natural product classes this technique is compelling and significant. The methodology is to appraise calories from organic product photographs straightforwardly without captivated with organic product classes and volumes. The works receiving this system are a pair. Natural product calories emphatically depend on the organic product classes, volumes, fixings, and cooking headings, and these show up within the presence of completed dishes. Irrespective of whether natural product classes are something similar, the natural product calories are distinctive relying upon utilized fixings and cooking headings. We predict assessing calories using the looks which is more important

within the errand of natural product calories assessment, which just cannot be settled by natural product classification assessment.

A. Measuring Calories and Nutrition from Food Image

Stoutness is one of the significant reasons for overweight that prompts the type-2 diabetes, coronary illness, & malignancy. For a fruitful solid eating routine, estimating the food is very vital. Estimating the calorie and sustenance in daily food is one of the difficult strategies so far. Cell phones assume a fundamental part in the current mechanical world which utilizes a method which will improve the issue of admission of dietary utilization [13]. In this task, fruit image captured is acknowledged and its framework is used for estimating the calorie and substance esteems are developed. Subsequent to capturing the food picture, the shape, the size, and the surface highlights would be extricated & given to the K-nearest neighbour (KNN) for perceiving the food and afterward the calorie esteem is estimated with the assistance of sustenance table.

Literature Review

A. A Food Recognition System for Diabetic Patients Based on Optimized Bag-of-features Model

Computer foresight-based food recognition may well be accustomed estimate for a food's carbohydrate quantity for diabetic patients [6]. This study has proposed a technique for automated food recognition, supported by the bag-of-features (BoF) model. An inside and out specialized examination was led for the ID and enhancement of the most straightforward performing parts which were included inside the BoF design, moreover as the assessment of the relating boundaries. A visible dataset with nearly five-thousand fruit pictures were prepared and arranged into seventeen classes for the planning and evaluation of the prototype system.[10]. The dense local features are computed using the optimal system. This is done using the scale invariant feature which transforms on the HSV color-space. It further builds a visible dictionary of ten-thousand visual words using the hierarchical k-means cluster algorithm. Lastly, it classifies the food pictures with the help of a linear support vector machine classifier [14]. This system achieved a classification accuracy of 78%. Thus, it has proved the feasibility of the proposed approach during a very challenging fruit-picture dataset.

B. Image-based Estimation of Real Food Size for Accurate Food Calorie Estimation

In this paper, work depends on picture-based assessment of genuine size of food varieties for exact food's calorie assessment that includes 3 existing works & 2 new works: (1) "Calorie Cam" is a framework to gauge genuine food's size dependent on an object reference. (2) Region division wise food calorie assessment. (3) "AR(Augmented Reality) Deep Calorie Cam V2" which depends on a visual inertial odometry which worked in an iOS AR Kit library. (4) "Profundity Calorie Cam" utilizes sound system camera on iPhones. (5) "Rice Calorie Cam" endeavors rice like grains as reference objects. Particularly, the last 2 new strategies have accomplished less than or equal to 10% assessment mistake, which is sufficient for a hearty food's calorie assessment [3].

C. Image-processing Based Approach for Personal Food Logging

Food pictures have been getting expanded consideration in late dietary control techniques. This paper presents the present status of electronic framework which can be utilized as dietary administration emotionally supportive network by customary Internet clients. The framework breaks down picture chronicles of the client to distinguish pictures of dinners. Further, picture examination decides the healthful piece of these dinners and stores the information to frame a Food log. The client can see the information in various formats, and furthermore alter the information to address any slip-ups that happened during picture investigation. This paper presents nitty gritty investigation of presentation of the present framework and proposes a development of examination by pre -grouping and personalization. Therefore, the exactness of food's balance assessment is altogether improvised [4].

D. A Novel SVM Based Food Recognition Method Calorie Measurement Applications

Arising food arrangement techniques assume a significant part in these days' food acknowledgment applications. For this reason, another acknowledgment calculation for food is introduced, thinking about its shape, shading, size, format, and surface qualities [6]. Utilizing different blends of these highlights, a superior characterization will be accomplished. In view of our reproduction results, the proposed calculation perceives food classifications with an endorsement acknowledgment pace of 92.6%, in normal.

III System Requirement Specification

There are a few system requirement specifications as explained below

A. Functional Requirement

The necessities would be UIs. The customers are the clients. All the clients can make use this item for requesting & looking.

- Equipment Interfaces: The outer hardware interface is used for requesting PCs of the clients. The strength of the PC would be convenient with far off LAN as the web affiliation would be far off
- Programming Interface: The functioning Frameworks could be any interpretation of the windows
- Execution Prerequisite: The PCs use should be at any rate Pentium-4 machine with the objective that they can give ideal execution of the thing.

B. Non-Functional Requirement

Non-utilitarian necessities are the limits offered by structure. It joins time objective and prerequisite on progression methodology and models. These non-helpful requirements are accompanied are as follows.

- Speed: The system must be set up for the offered commitment to yield inside fitting time
- Simplicity of usage: The item thought to be straightforward. By then, the customers could use easily, which doesn't need a lot getting ready time
- Dependability: The pace of dissatisfactions should be not exactly the system as is more strong
- Movability: It thought to be anything besides hard to complete in any system

C. Hardware Requirement

The most general requirement is the actual PC resource, in any case called hardware. Hardware necessities list is as often as possible joined by a gear comparability list, especially if there ought to be an event of working structures. A HCL records attempted, great, and from time-to-time incongruent gear devices used for peculiar working structure. Sub-fragments look at the changed pieces of gear essentials.

All the PC working structures are used to propose for a particular PC's plan. The programming applications are confined to explicit working systems running on explicit designs. Notwithstanding the way that designing free working structures & applications that exist, most of them recompiled to continue to execute on another plan.

The energy of the Central Processing Unit (CPU) is a focal system need of any item [7]. The program executing on x86 designing describe planning power as a model and its clock speed of the Central Processing Unit. Various features of a Central Processing Unit which sway its machine speed and force, more like a vehicle speed, store, & MIPS are mostly disregarded. This importance of energy is routinely off-base, as an AMD (Advanced Micro Devices) Intel's Pentium Central Processing Units at relative clock speed habitually have particular throughput speed.

- 10GB Hard disk (minimum)
- 128 MB Random Access Memory (minimum)
- 2.8Ghz Pentium P4 Processor (minimum)

Software Requirements

Programming necessities manage characterizing programming asset necessities and requirements to be introduced on a PC (Personal Computer) to give ideal working of an application.

These necessities are generally rejected in the item foundation group and ought to be presented freely before the item is presented.

- Python 2.7 or higher
- PyCharm
- OpenCV

2. Materials And Methods

Existing System

- Various approaches have been proposed up until this point and the guideline approach is to evaluate
 calories subject to surveyed natural item classes and its size or volume using the assessment of
 natural item calorie per unit locale or volume
- A picture based common item calorie evaluation strategy that examinations natural item classes and volumes by significance cameras like Kinect. Significance cameras, for instance, Kinect is an excellent device, which is accepted that is difficult to use generally

B. Proposed System

The below **Fig. 1** shows the proposed system with all the attributes.

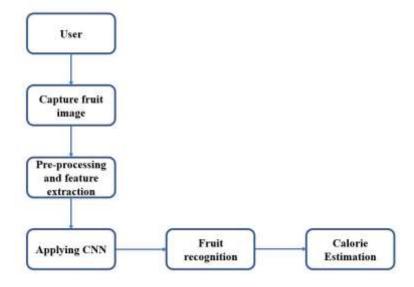


Fig. 1 Block Diagram of Proposed System

C. Methodology

There are six methodologies we would be discussing out here.

- i. *Dataset Collection:* For the assortment of the organic product pictures in our dataset, we partitioned the organic product pictures into two distinct assortments: single natural product parcels and blended organic product divides. We contemplated significant elements that influence the exactness of our outcomes. In particular, we utilized an assortment of the accompanying segments: Camera, Shoot Angle, Light, White-Plate, Thumbs, Single & Mixed Fruit. Every part would be depicted in detail in accompanying subsections. The actual camera will affect the outcomes regarding its focal point, equipment, and programming.
- ii. Fruit Item Types: The dataset here contains pictures that are captured with various camera, enlightenments, and points. It has a wide assortment of fruits grown from the ground gives a superior and more dependable dataset to expand the exactness of calorie organic product estimation frameworks. The name and number of single natural product pictures are remembered for the dataset. In the dataset, the pictures are separated into 6 classifications thinking about the catching gadget, foundation, and lighting condition [12]. For instance, pictures in class 1 are caught with a Samsung camera, inside a light climate with a white foundation, and from various shooting points [11].

iii. Pre-processing:

Picture Cropping: Note that the pictures from PFID (Pittsburgh cheap food picture dataset) are taken in the research facility with a gigantic white foundation. It is by and large viewed as great to trim out the highlights being referred to for a superior CNN (Convolutional Neural Network) result. Subsequently, we utilize the capacity crop from Python Image Library to handle these pictures.

Information Augmentation: We turn pictures each time by 45 degrees from 45 degree to 315 degree. We acquire 18323 pictures completely. We split the informational index into preparing set (13425 pictures), approve set (2264 pictures) and test set (2632 pictures). Hoard highlights HOG (Histogram of Gradients) is a nearby element descriptor applied in picture preparing. The picture is separated into little locales called Cell and escalate inclinations are determined preposterous in the phones.

iv *Feature Extraction*: To lessen the preparation time in ensuing advances and improve the nature of learnt models, one by one picture is taken and is trimmed and lit up, and later re-sized to a minimum

of 4% of the picture's underlying size. Main grid contains a cell for each of the pixel in the image which is used to address red force of that particular pixel. Also, the 2nd and 3rd grids contain a cell for each of the pixel which is used to address the blue & green force of pixel. We would think about each cell in every one of these 3 grids as an element, which would bring about an average aggregate of eleven thousand eight hundred and sixty-eight (11,868) highlights addressing a given image. We additionally tried alternate things with alternate methodologies for addressing pictures. For example, instead of the standard RGB-portrayal, we can utilize another portrayal of images by using the average of the red color, green color, and blue color segments of each pixel [8]. Likewise, we additionally can utilize what is called a grayscale portrayal of an image, just as, a highly contrasting (BW: White - Black) portrayal of an image with a degree which is 0.5, and yet another one with a degree which is 0.7, where level would be on an edge that decides if at all a pixel is addressed as a 1 which is dark or a 0 which is white. That is, addressing a given pixel as a 0 off chance which it has a luminance more with a noteworthy than a level, and a 1 in any case. In these last four portrayals (found the middle value of RGB, grayscale, BW-0.5 and BW-0.7), each picture is addressed utilizing 3,956 highlights.

v Fruit Recognition: First and foremost, to have exact results for our division, a fundamental change ought to be performed on a given image to alter the image size to a standard game plan. For this, size of each and every image would be differentiated, and the standard sizes are sorted. If at all, the image's size isn't feasible with any of the size class, a few managing or padding methodologies would be applied to image. We now have described as one- size class, for instance 970×720 which is easy. Greater pictures would be changed as per this considered size, preceding playing out any of the image getting ready method. After this stage, in the division step, each of the image is separated to remove multiple segments which are of the common item bundle. We considered the division segment arrangement which would help ensure the photos are dealt with appropriately. In particular, we used a concealing division, k-mean gathering, and surface division instruments. Moreover, in our request and common item affirmation examination, we assigned Cloud Support Vector Model and significant neural association strategy in order to fabricate the exactness of the affirmation system.

vi Calories Estimation: At long last, we show the test aftereffects of our primary assignment, in particular calories expectation of organic product things. As in the past two learning errands, we split our dataset again into two sets: train (80%), and test (20%). The subsequent twenty-three highlights which are the highlight decrease were later taken care of organic product type classifier which is used to yield a good anticipated natural product for image. The anticipated organic product or fruit is turned into an additional component for an image. Likewise, the diminished highlights were used to pass to the learnt size indicator which is used to yield a size which is expected for the natural product. This likewise scholarly component was attached to the picture highlights for the calorie's expectation task. Subsequently, to sum up, each picture was addressed utilizing 23 visual highlights in addition to an expected natural product type and size.

D. System Design

Framework configuration is one of the ways towards marking the designs, modules, parts, information, and interface for framework which are used to fulfill a determined set of prerequisites. It can be considered to use the frameworks of hypothesis to itemize the advancement. The framework's investigation and framework's design is under cover. In the event that the more extensive subject of item improvement mixes the point of view of promoting, plan, and assembling into a solitary way to deal with item advancement, at that point configuration is the demonstration of taking the showcasing data and making the plan of the item to be produced [15-20].

V FLOWCHART AND IMPLEMENTATION

The below flow chart in **Fig. 2** shows the project flow.

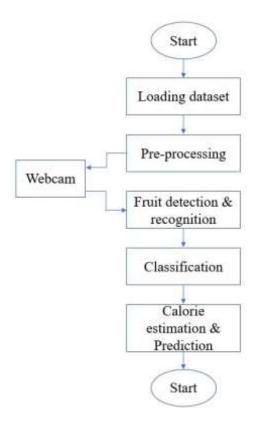


Fig. 2 Flowchart of the proposed system

A. CNN Module

For pictures acknowledgment utilizing Deep Neural Networks, we are utilizing multi-facet Deep Convolutional Neural Network [CNN]. We have likewise utilized two distinct apparatuses, Keras + Theano and TensorFlow by Google to show the functioning precision of Deep Neural Networks. Convolutional Neural Network: This is a kind of feed forward Artificial Neural Network where availability design between its neurons is enlivened by the association of the creature visual cortex. Convolutional Neural Networks comprise of neurons which are learnable loads & predispositions. Every neuron would get some information, which play as a spot item, and follows with non-linearity.

B. Implementation

The images of different fruits have been collected based on different angles of shoot, size, and texture. These images are fed to our training code. The training code includes Keras for image processing. Keras TensorFlow high-level API is used to build and train deep learning model. This is used for quick prototyping, state of art research, & the production. Keras Optimizers are used to compile Keras model. Python pickle module is helpful here for the serialization and de-serialization of a Python's object structure. Pickling is a method to convert a Python's object such as list, dictionary to a character stream. Initially, we capture the image data paths and then shuffle all of them randomly. Then, we load the picture, resize it, pre-process the picture and store the picture in a data-list. We now extract the class label from the picture's path and accordingly update the label's list. We would then scale the raw-pixel intensity to a certain threshold. We then binarize the label, divide the data into training data and testing data using the 80:20 rule, i.e., 80% for training and 20% for testing. The data augmenter is then initialized.

Adam optimizer is used to build the model. SmallerVGGNet model is used for classification of images. SmallerVGGNet is the CNN (Convolutional Neural Network) architecture used for classification of images. SmallerVGGNet is Convolutional Neural Network architecture which has four different layers like *activate*, *drop*, *dense and fully converted layers*. '.fit' methods are used for data augmentation to make the code more consistent. Our network will train with 100 EPOCS in order to learn the images by incremental improvements via backpropagation algorithm. Thus, at the end of the training, we will be generated with training model and pickle model which would further help us in predicting the fruit image.

Once the training model is ready, we then capture the image using the webcam or the system camera to capture the fruit image. This is fed as an input to the classification code. The fruit image captured is converted to RGB (Red Blue Grey) scale, resized, and altered with its dimensions. We now ship the

trained CNN (Convolutional neural network) and binarize the labels obtained from train model and pickle. The captured image is then classified and predicted using predict methods. Once the image is predicted a label is built and the same label is displayed on the image along with the prediction percentage.

Calorie estimation:

We now arrive at a point where the fruit is recognized, and we are left to estimate its calories. A csv file is maintained which consists of a list of calories of all the fruits images which are used for training depending on the fruit categories as well. This data is then pulled to predict the calories of the fruit image recognized.

C. Testing

Testing is usually done in order to eradicate the errors from the system which is developed. The main intension of testing is that it would check if the requirements are met or not. It also checks if there is any deviation of the system's behavior from the actual specification document. Testing is performed at various different stages during the build of the software. A test certified software is well qualified to be sold out in the market and is of high demand. Testing not only includes verification but also includes validation which is of utmost use.

D. Test Objectives

Testing is a method of executing a program with an intension to discover a defect. A decent test case is one which is used to unearth more defects. A good test is one which uncovers an unseen defect. On the off chance that testing is directed effectively (as indicated by the targets) it will reveal mistakes in the product. Testing can't show the non-attendances of deformities are available. It can just show that product surrenders are available.

E. System and Acceptance Testing

- System testing: This is nothing but a type of testing where a series of different tests where the computer-based system would be tested completely to fulfil the requirements
- Acceptance testing: This is at times performed with real time data of the customer which is used to portray that the software developed is working properly according to the customer requirements

Below are some of the output images where the fruit image captured is recognized along with its prediction percentage and the calorie of the fruit is displayed.



Fig. 5 RGB of Apple



Fig. 6 Output for Apple



Fig. 5 RGB of Golden Apple



Fig. 7 RGB of Banana

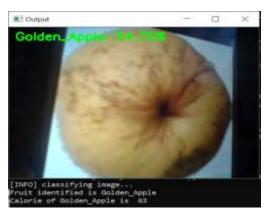


Fig. 6 Output for Golden Apple



Fig. 8 Output for Banana

Fig. 3 shows the image of the fruit which is captured from the system camera which is converted to RGB (Red, Grey, Blue) color. And hence the color of the fruit varies. Next, in Fig. 4, we can see that the fruit is recognized as Red Apple whose prediction is 99.83%. Later, in the console the calorie of this fruit is displayed by extracting the values from the csv file. Similarly, the other fruit images are captured, converted to RGB color and the recognition and estimation takes place. Images of Golden Appel and Banana are shown in fig. 5, 6 7 and 8.

4. Conclusion

In this paper, we proposed assessing organic product or fruit calorie from a natural product photograph by concurrent learning of organic product calories, classes, fixings, size, and check utilizing perform various tasks of CNNs (Convolutional Neural Network). In these tests, in both datasets, the exhibitions to perform various tasks CNNs beat the aftereffect of autonomous single-task CNNs. For profoundly precise natural product calorie assessment, natural product location and division are significant, and utilizing a pre-enrolled reference article might be essential. It is likewise possible to gauge the volume of organic product from pictures from various perspectives We expect substantially more exact calorie assessment is conceivable by presenting multiple tasks Convolutional Neural Network based calorie assessment into the volume or a size-based calorie assessment draws near.

References:

- [1] V Hemalatha Reddy, Soumya Kumari, Vinitha Muralidharan, Karan Gigoo, and Bhushan S Thakare. Food Recognition and Calorie Measurement using Image Processing and Machine Learning Techniques, Jan 2020.
- [2] Guillermo Sánchez-Delgado Eric Ravussin, Assessment of energy expenditure: are calories measured differently for different diets?, Current Opinion in Clinical Nutrition and Metabolic Care, July 2020.
- [3] Takumi Ege, Yoshikazu Ando, Ryosuke Tanno, Wataru Shimoda, Keiji Yanai. Image-Based Estimation of Real Food Size for Accurate Food Calorie Estimation, Conference: 2019 IEEE Conference on Multimedia Information Processing and Retrieval (MIPR) Mar 2019
- [4] Keigo Kitamura, Chaminda de Silva, Chaminda de Silva, Toshihiko Yamasaki, Kiyoharu Aizawa. Image processing-based approach to food balance analysis for personal food logging. Conference: Multimedia and Expo (ICME), 2010 IEEE International Conference Aug 2010
- [5] V. Bettadapura, E. Thomaz, A. Parnami, G. D. Abowd, and I. Essa. Leveraging context to support automated fruit recognition in restaurants. In WACV, pages 580–587, 2015.

- [6] L. Bossard, M. Guillaumin, and L. Van Gool. Fruit-101: Mining discriminative components with random forests. In ECCV, 2014.
- [7] J. Chae, I. Woo, S. Kim, R. Maciejewski, F. Zhu, E. J. Delp, C. J. Boushey, and D. S. Ebert. Volume estimation using fruit specific shape templates in mobile image-based dietary assessment. In Proc. SPIE, 2011
- [8] C. Champagne, G. Bray, A. Kurtz, J. Montiero, E. Tucker, J. Voaufova, and J. Delany. Energy intake and energy expenditure: a controlled study comparing dietitians and nondietitians. J. Am. Diet. Assoc., 2002.
- [9] G. M. Farinella, D. Allegra, and F. Stanco. A benchmark dataset to study the representation of food images. In ECCV Workshop Assistive CV, 2014.
- [10] M. Chen, K. Dhingra, W. Wu, L. Yang, R. Sukthankar,
- and J. Yang. PFID: Pittsburgh fast-food image dataset. In ICIP, pages 289-292, 2009.
- [11] F. Cordeiro, E. Bales, E. Cherry, and J. Fogarty. Rethinking the mobile food journal: Exploring opportunities for lightweight Photo-Based capture. In CHI, 2015.
- [12] F. Cordeiro, D. Epstein, E. Thomaz, E. Bales, A. K. Jagannathan, G. D. Abowd, and J. Fogarty. Barriers and negative nudges: Exploring challenges in food journaling. In CHI, 2015.
- [13] J. Dehais, S. Shevchik, P. Diem, and S. G. Mougiakakou. Food volume computation for self-dietary assessment applications. In 13th IEEE Conf. on Bio info. and Bioeng., pages 1–4, Nov. 2013.
- [14] J. Deng, J. Krause, A. C. Berg, and L. Fei-Fei. Hedging your bets: Optimizing accuracy-specificity trade-offs in large scale visual recognition. In CVPR, pages:3450–3457,June-2012.
- [15] Sudhan Murugan Bhagavathi, Anitha Thavasimuthu, Aruna Murugesan, Charlyn Pushpa Latha George Rajendran, A Vijay, Raja Laxmi, Rajendran Thavasimuthu, Weather forecasting and prediction using hybrid C5.0 machine learning algorithm International Journal of Communication Systems, Vol. 34, Issue. 10, Pp. e4805, 2021.
- [16] PM Surendra, S Manimurugan, A New Modified Recurrent Extreme Learning with PSO Machine Based on Feature Fusion with CNN Deep Features for Breast Cancer Detection, Journal of Computational Science and Intelligent Technologies, Vol. 1, Issue. 3, Pp. 15-21, 2020.
- [17] PK Sadineni, Comparative Study on Query Processing and Indexing Techniques in Big Data, 2020 3rd International Conference on Intelligent Sustainable Systems (ICISS), pp. 933-939, 2020.
- [18] AH Omar Baabood, Prajoona Valsalan, Tariq Ahmed Barham Baomar, IoT Based Health Monitoring System, Journal of Critical Reviews, Vol. 7, Issue. 4, pp. 739-743, 2020.
- [19] Sajay KR, Suvanam Sasidhar Babu, Vijayalakshmi Yellepeddi, Enhancing The Security Of Cloud Data Using Hybrid Encryption Algorithm, Journal of Ambient Intelligence and Humanized Computing, 2019. https://doi.org/10.1007/s12652-019-01403-1
- [20] Bindhia K Francis, Suvanam Sasidhar Babu, Predicting academic performance of students using a hybrid data mining approach, Journal of Medical Systems, 43:162, 2019. https://doi.org/10.1007/s10916-019-1295-4