

BREAST CANCER PREDICTION USING MACHINE LEARNING

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ABSTRACT:

Machine learning is a technology which allows a software program to become more accurate at pretending more accurate results without being explicitly programmed and also ML algorithms uses historic data to predict the new outputs.

Because of this ML gets a distinguish attention. Now a day's prediction engine has become so popular that they are generating accurate and affordable predictions just like a human, and being using industry to solve many of the problems.

Breast cancer is one of the most common cancers among women worldwide, representing the majority of new cancer cases and cancer-related deaths according to global statistics, making it a significant public health problem in today's society. The early diagnosis can improve the prognosis and chance of survival significantly, as it can promote timely clinical treatment to patients. Thus, the correct diagnosis of Breast cancer and classification of patients is the subject of much research. Because of its unique advantages in critical features detection from complex Breast Cancer Datasets, machine learning is widely recognized as the methodology of choice in Breast Cancer pattern classification and forecast modelling.

Keywords:

Machine Learning, Random Forest Classifier, Model Selection, Classification, Prediction, Supervised Learning

INTRODUCTION:

Breast cancer is a disease in which cells in the breast grow out of control. There are different kinds of breast cancer. The kind of breast cancer depends on which cells in the breast turn into cancer. Breast cancer can begin in different parts of the breast. A breast is made up of three main parts: lobules, ducts, and connective tissue. The lobules are the glands that produce milk. The ducts are tubes that carry milk to the nipple. The connective tissue (which consists of fibrous and fatty tissue) surrounds and holds everything together. Most breast cancers begin in the ducts or lobules. Breast cancer can spread outside the breast through blood vessels and lymph vessels. When breast cancer spreads to other parts of the body, it is said to have metastasized.

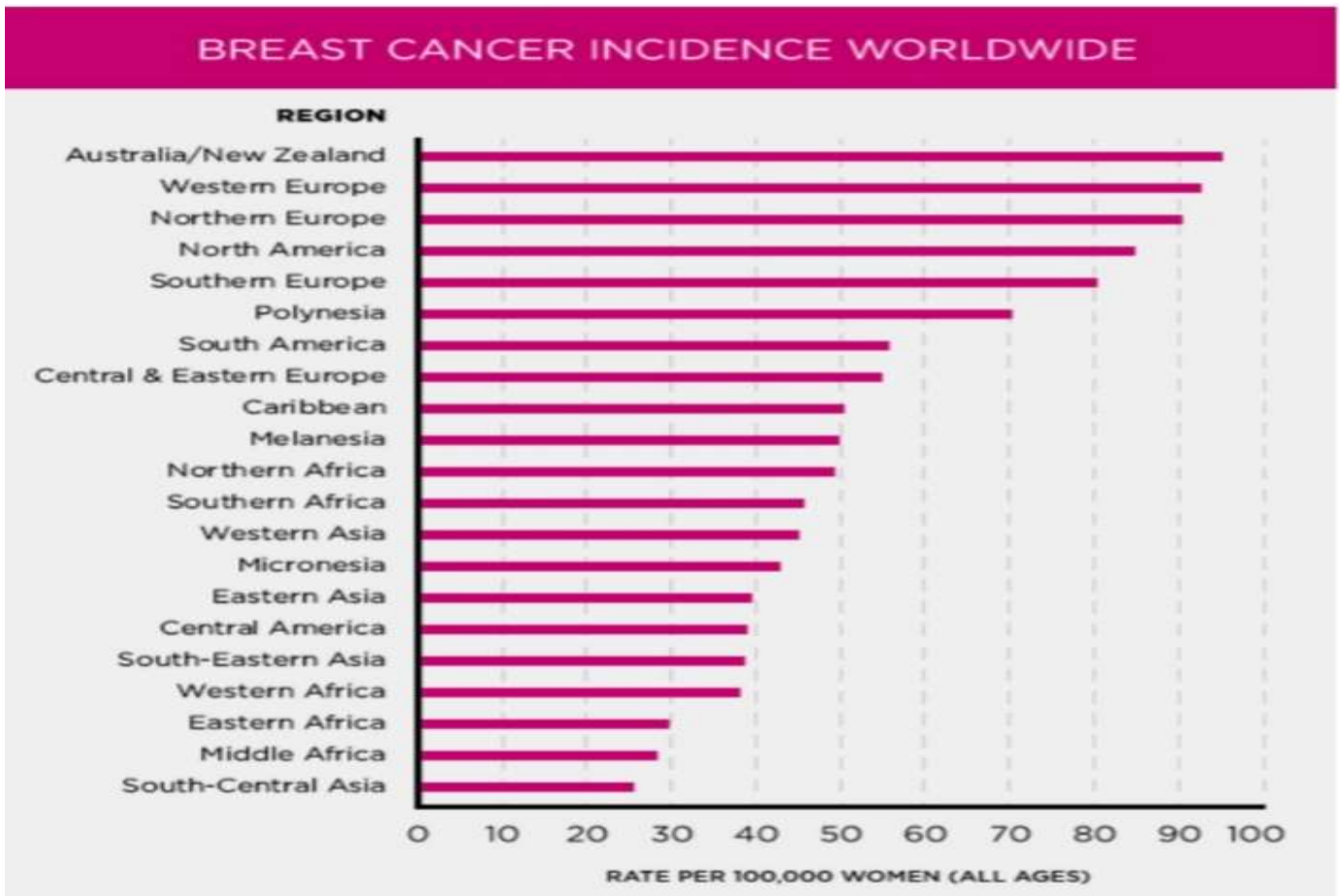
Machine learning is one of the applications of artificial intelligence (AI) that provides computers, the ability to learn automatically and improve from experience instead of explicitly programmed. It focuses on developing computer programs that can access data and use it to learn from themselves. The main aim is to allow computers to learn automatically without human intervention and also adjust actions accordingly. Breast

cancer has a great deal of attention in medical research. The diagnosis of breast cancer is a challenging task, which can offer automated prediction about the condition of patient so that further treatment can be made effective. Classification algorithms are very important category of supervised machine learning algorithms. These algorithms require a very large training set. These training data sets are consisting of many features or attributes which describe the individual sample. Since we are doing supervised learning algorithm. All the training set are labelled correctly. The classification algorithms such as Decision Tree, Naive Bayes, Random Forest Classifier, K-Nearest Neighbours, Logistic Regression and Support Vector Count (SVC), develop model with these data with many different parameters. When we have a new unlabelled sample, we can use the model to predict the label of the new sample. These techniques are used for disease diagnosis to help doctor to effectively label the new case.

LITERATURE SURVEY:

Statistics show a breast cancer prevalence rate of 25.8 women per 100000 women in India. Considering the population of 1.3 billion Indians with half female population, this amounts to almost 350000 women living with breast cancer in India for all ages combined as per a study done in 2017. This is projected to increase to a staggering 1800000 by early 2020 as per predictions as there is increasing awareness and detection in the population. Thus, this shows us the scale and magnitude of the disease and is the number 1 cancer among women in India surpassing cervical cancer with 25 – 32% of all cancers affecting women being breast cancers. Thiruvananthapuram, Chennai, Delhi and Mumbai have shown the highest prevalence of breast cancer in the Country. A few other worrying statistics have shown that the incidence of breast cancer in populations below 50 years of age has doubled as compared to 25 years ago along with an increase in mortality (risk of death) of breast cancer by approximately 13% as compared to 5 years back. Almost 45-50 % of patients in India present in the advanced stages (Stage 3 and 4) as per another study. All these facts and figures entail that India still has enormous scope to improve the detection and quality of treatment that can be given to breast cancer patients.

Machine learning products Madhu Kumari and Virendra Singh [3] used many approaches for detecting breast cancer by means rough sets and Back propagation neural network, Feature extraction using a hybrid of k-means and SVM, LR Neural Network and Decision tree. Highest accuracy is 98.6% for rough sets and back propagation. Hiba Asria, Hajarmousannifb, Hassan Al Moatassimec, Thomas Noeld [4] compared 4 machine learning algorithms they are support vector machine, Naïve Bayes, k-nearest neighbour's, decision tree. Highest accuracy is 97.3% for support vector machine.



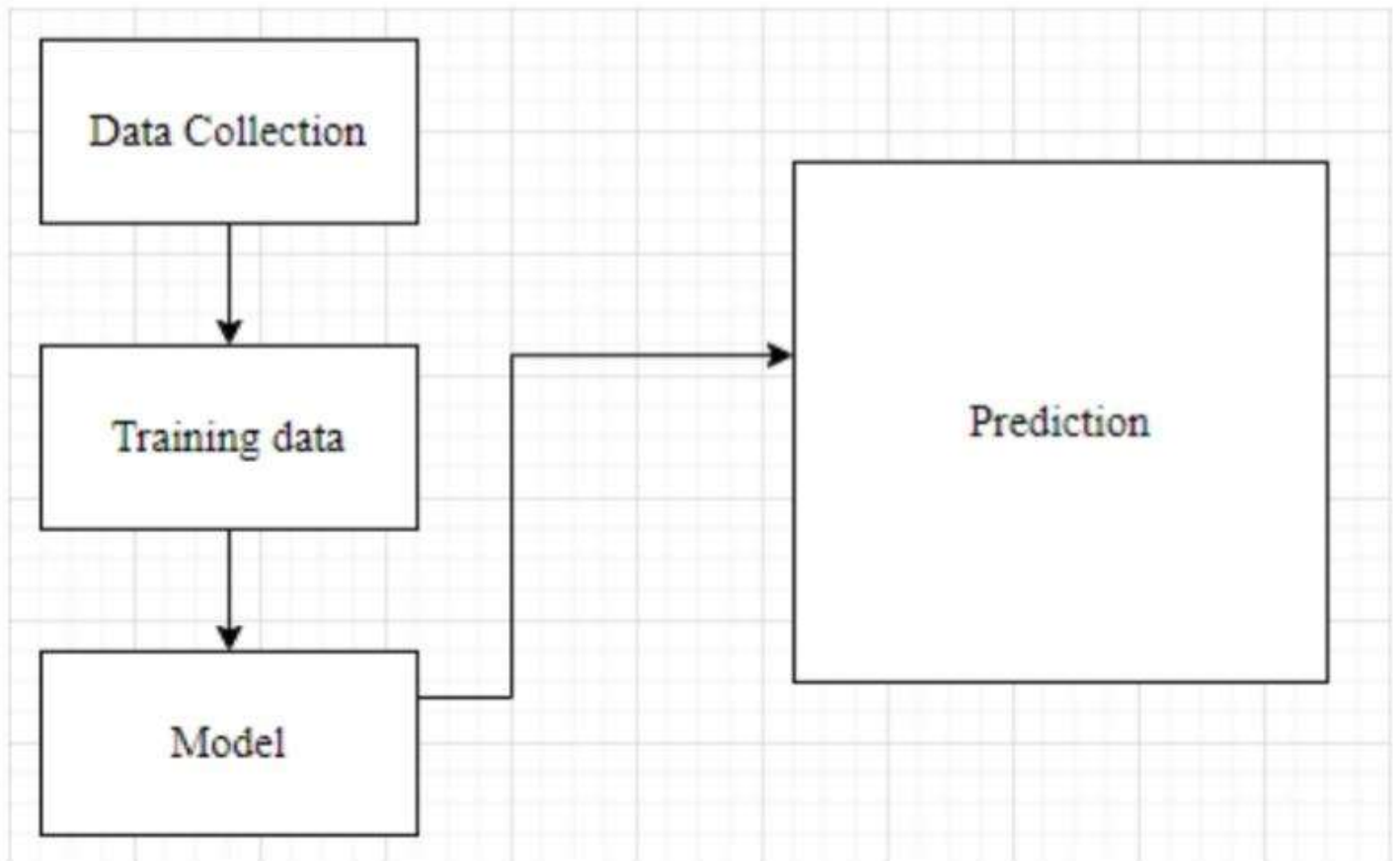
PROPOSED:

To identify breast cancer symptoms at early stage to save someone's life by using data mining techniques and machine learning models on dataset.

Advantages:

1. Generate accurate and efficient results.
2. Computation time is greatly reduced.
3. Reduces manual work.
4. Efficient further treatment.
5. Automated prediction.

SYSTEM ARCHITECTURE:



DATA SET:

| | A | B | C | D | E | F | G | H | I | J | K | L | M | N | O |
|----|----|-----------|-----------|----------|----------|----------|----------|----------|----------|----------|-----------|-----------|------------|-----------|------------|
| 1 | | mean radi | mean text | mean per | mean are | mean smc | mean cor | mean con | mean con | mean sym | mean frac | radius er | texture er | perimeter | area error |
| 2 | 0 | 17.99 | 10.38 | 122.8 | 1001 | 0.1184 | 0.2776 | 0.3001 | 0.1471 | 0.2419 | 0.07871 | 1.095 | 0.9053 | 8.589 | 153.4 |
| 3 | 1 | 20.57 | 17.77 | 132.9 | 1326 | 0.08474 | 0.07864 | 0.0869 | 0.07017 | 0.1812 | 0.05667 | 0.5435 | 0.7339 | 3.398 | 74.08 |
| 4 | 2 | 19.69 | 21.25 | 130 | 1203 | 0.1096 | 0.1599 | 0.1974 | 0.1279 | 0.2069 | 0.05999 | 0.7456 | 0.7869 | 4.585 | 94.03 |
| 5 | 3 | 11.42 | 20.38 | 77.58 | 386.1 | 0.1425 | 0.2839 | 0.2414 | 0.1052 | 0.2597 | 0.09744 | 0.4956 | 1.156 | 3.445 | 27.23 |
| 6 | 4 | 20.29 | 14.34 | 135.1 | 1297 | 0.1003 | 0.1328 | 0.198 | 0.1043 | 0.1809 | 0.05883 | 0.7572 | 0.7813 | 5.438 | 94.44 |
| 7 | 5 | 12.45 | 15.7 | 82.57 | 477.1 | 0.1278 | 0.17 | 0.1578 | 0.08089 | 0.2087 | 0.07613 | 0.3345 | 0.8902 | 2.217 | 27.19 |
| 8 | 6 | 18.25 | 19.98 | 119.6 | 1040 | 0.09463 | 0.109 | 0.1127 | 0.074 | 0.1794 | 0.05742 | 0.4467 | 0.7732 | 3.18 | 53.91 |
| 9 | 7 | 13.71 | 20.83 | 90.2 | 577.9 | 0.1189 | 0.1645 | 0.09366 | 0.05985 | 0.2196 | 0.07451 | 0.5835 | 1.377 | 3.856 | 50.96 |
| 10 | 8 | 13 | 21.82 | 87.5 | 519.8 | 0.1273 | 0.1932 | 0.1859 | 0.09353 | 0.235 | 0.07389 | 0.3063 | 1.002 | 2.406 | 24.32 |
| 11 | 9 | 12.46 | 24.04 | 83.97 | 475.9 | 0.1186 | 0.2396 | 0.2273 | 0.08543 | 0.203 | 0.08243 | 0.2976 | 1.599 | 2.039 | 23.94 |
| 12 | 10 | 16.02 | 23.24 | 102.7 | 797.8 | 0.08206 | 0.06669 | 0.03299 | 0.03323 | 0.1528 | 0.05697 | 0.3795 | 1.187 | 2.466 | 40.51 |
| 13 | 11 | 15.78 | 17.89 | 103.6 | 781 | 0.0971 | 0.1292 | 0.09954 | 0.06606 | 0.1842 | 0.06082 | 0.5058 | 0.9849 | 3.564 | 54.16 |
| 14 | 12 | 19.17 | 24.8 | 132.4 | 1123 | 0.0974 | 0.2458 | 0.2065 | 0.1118 | 0.2397 | 0.078 | 0.9555 | 3.568 | 11.07 | 116.2 |
| 15 | 13 | 15.85 | 23.95 | 103.7 | 782.7 | 0.08401 | 0.1002 | 0.09938 | 0.05364 | 0.1847 | 0.05338 | 0.4033 | 1.078 | 2.903 | 36.58 |
| 16 | 14 | 13.73 | 22.61 | 93.6 | 578.3 | 0.1131 | 0.2293 | 0.2128 | 0.08025 | 0.2069 | 0.07682 | 0.2121 | 1.169 | 2.061 | 19.21 |
| 17 | 15 | 14.54 | 27.54 | 96.73 | 658.8 | 0.1139 | 0.1595 | 0.1639 | 0.07364 | 0.2303 | 0.07077 | 0.37 | 1.033 | 2.879 | 32.55 |
| 18 | 16 | 14.68 | 20.13 | 94.74 | 684.5 | 0.09867 | 0.072 | 0.07395 | 0.05259 | 0.1586 | 0.05922 | 0.4727 | 1.24 | 3.195 | 45.4 |
| 19 | 17 | 16.13 | 20.68 | 108.1 | 798.8 | 0.117 | 0.2022 | 0.1722 | 0.1028 | 0.2164 | 0.07356 | 0.5692 | 1.073 | 3.854 | 54.18 |
| 20 | 18 | 19.81 | 22.15 | 130 | 1260 | 0.09831 | 0.1027 | 0.1479 | 0.09498 | 0.1582 | 0.05395 | 0.7582 | 1.017 | 5.865 | 112.4 |
| 21 | 19 | 13.54 | 14.36 | 87.46 | 566.3 | 0.09779 | 0.08129 | 0.06664 | 0.04781 | 0.1885 | 0.05766 | 0.2699 | 0.7886 | 2.058 | 23.56 |
| 22 | 20 | 13.08 | 15.71 | 85.63 | 520 | 0.1075 | 0.127 | 0.04568 | 0.0311 | 0.1967 | 0.06811 | 0.1852 | 0.7477 | 1.383 | 14.67 |
| 23 | 21 | 9.504 | 12.44 | 60.34 | 273.9 | 0.1024 | 0.06492 | 0.02956 | 0.02076 | 0.1815 | 0.06905 | 0.2773 | 0.9768 | 1.909 | 15.7 |
| 24 | 22 | 15.34 | 14.26 | 102.5 | 704.4 | 0.1073 | 0.2135 | 0.2077 | 0.09756 | 0.2521 | 0.07032 | 0.4388 | 0.7096 | 3.384 | 44.91 |
| 25 | 23 | 21.16 | 23.04 | 137.2 | 1404 | 0.09428 | 0.1022 | 0.1097 | 0.08632 | 0.1769 | 0.05278 | 0.6917 | 1.127 | 4.303 | 93.99 |

IMPLEMENTATION:

- Data Collection.
- Data Preprocessing.
- Model Selection.
- Train the model.
- Evaluating model.
- Making Predictions.

Data Collection:

- The dataset used for the project is Wisconsin Breast Cancer Dataset collected from UCI repository.

- [https://archive.ics.uci.edu/ml/datasets/breast+cancer+wisconsin+\(original\)](https://archive.ics.uci.edu/ml/datasets/breast+cancer+wisconsin+(original))

- Attributes in the dataset are:

- | | |
|--------------------------|--------------------|
| 1. Clump Thickness | 6. Bare Nuclei |
| 2. Uniformity Cell Size | 7. Bland Chromatin |
| 3. Uniformity Cell Shape | 8. Normal Nucleoli |
| 4. Marginal Adhesion | 9. Mitoses |

Data Preprocessing:

- Loading the dataset and training the data to predict the result is called Data preparation
- Cleaning the data by filling missing data comes under Data training.
- Many Preprocessing techniques like Correlation, SMOTE, Filling missing values are used in data preparation.

Model Selection:

- Model selection is the process of choosing between different machine learning approaches - e.g. SVM, logistic regression, etc. - or choosing between different hyperparameters or sets of features for the same machine learning approach. Some of the models used in this project are:

1. Random Forest Classifier
2. Logistic Regression
3. Gaussian Naïve Bayes
4. SVC
5. K-Nearest Neighbors
6. Decision Tree

Train the model:

- Creating a train and test split of your dataset is one method to quickly evaluate the performance of an algorithm on your problem. The training dataset is used to prepare a model, to train it. We pretend the test dataset is new data where the output values are withheld from the algorithm.
- In Breast Cancer Detection project we have spitted original data into two Datasets. Training Data with 70% of original data, testing data with 30% of original data.

Evaluating Model:

- Model evaluation aims to estimate the generalization accuracy of a model on future (unseen) data.
- Methods for evaluating Model's performance are divided into 2 categories: Holdout and Cross-validation. Both methods use a test set (i.e. data not seen by the model) to evaluate model performance.

Comparison of Algorithms:

Comparison of algorithms by using K-Fold

| | Model | Train_Score | Test_Score | Accuracy |
|---|------------------------|-------------|------------|------------|
| 3 | Random Forest | 100.00 | 100.00 | 100.000000 |
| 0 | Gaussian Naive Bayes | 97.37 | 99.12 | 99.115044 |
| 4 | Logistic Regression | 94.96 | 99.12 | 99.115044 |
| 1 | Decision Tree | 96.71 | 98.23 | 98.230088 |
| 5 | K-Nearest Neighbours | 96.71 | 98.23 | 98.230088 |
| 2 | Support Vector Machine | 59.65 | 78.76 | 78.761062 |

RESULTS:

HOME PAGE:



The home page features a purple ribbon logo on the left and the title "BREAST CANCER PREDICTION" in white text on a purple background on the right. Below the title is a paragraph of text: "Breast cancer is the second most common cancer worldwide and the most commonly occurring malignancy in women. There is growing evidence that lifestyle factors, including diet, body weight and physical activity, may be associated with higher BC risk. However, the effect of dietary factors on BC recurrence and mortality is not clearly understood. Here, we provide an overview of the current evidence obtained from the PubMed databases in the last decade, assessing dietary patterns, as well as the consumption of specific food-stuffs/food-nutrients, in relation to BC incidence, recurrence and survival. Data from the published literature suggest that a healthy dietary pattern characterized by high intake of unrefined cereals, vegetables, fruit, nuts and olive oil, and a moderate-low consumption of saturated fatty acids and red meat, might improve overall survival after diagnosis of BC. BC patients undergoing chemotherapy and radiotherapy experience a variety of symptoms that worsen patient quality of life. Studies investigating nutritional interventions during BC treatment have shown that nutritional counselling and supplementation with some dietary constituents, such as EPA and DHA, might be useful in limiting drug-induced side effects, as well as in enhancing therapeutic efficacy. Therefore, nutritional intervention in BC patients may be considered an integral part of the multimodal therapeutic approach. However, further research utilizing dietary interventions in large clinical trials is required to definitively establish effective interventions in these patients, to improve long-term survival and quality of life."

Below the text is a form titled "Enter the value of tumor features" containing a 4x4 grid of input fields for the following features: mean radius, mean texture, mean smoothness, mean compactness, mean concavity, mean concave points, mean symmetry, mean fractal dimension, radius error, texture error, perimeter error, area error, smoothness error, compactness error, concavity error, concave points error, symmetry error, fractal dimension error, worst radius, worst texture, worst smoothness, worst compactness, worst concavity, worst concave points, worst symmetry, and worst fractal dimension. A "Predict Cancer" button is located below the grid. In the bottom right corner, there is a watermark that says "Activate Windows Go to Settings to activate Windows."

Has Breast Cancer:



BREAST CANCER PREDICTION

Breast cancer is the second most common cancer worldwide and the most commonly occurring malignancy in women. There is growing evidence that lifestyle factors, including diet, body weight and physical activity, may be associated with higher BC risk. However, the effect of dietary factors on BC recurrence and mortality is not clearly understood. Here, we provide an overview of the current evidence obtained from the PubMed databases in the last decade, assessing dietary patterns, as well as the consumption of specific food-stuffs/food-nutrients, in relation to BC incidence, recurrence and survival. Data from the published literature suggest that a healthy dietary pattern characterized by high intake of unrefined cereals, vegetables, fruit, nuts and olive oil, and a moderate/low consumption of saturated fatty acids and red meat, might improve overall survival after diagnosis of BC. BC patients undergoing chemotherapy and radiotherapy experience a variety of symptoms that worsen patient quality of life. Studies investigating nutritional interventions during BC treatment have shown that nutritional counselling and supplementation with some dietary constituents, such as EPA and DHA, might be useful in limiting drug-induced side effects, as well as in enhancing therapeutic efficacy. Therefore, nutritional intervention in BC patients may be considered an integral part of the multimodal therapeutic approach. However, further research utilizing dietary interventions in large clinical trials is required to definitively establish effective interventions in these patients, to improve long-term survival and quality of life.

Enter the value of tumor features

| | | | |
|------------------|-------------------------|-------------------------|------------------------|
| mean radius | mean texture | mean smoothness | mean compactness |
| mean concavity | mean concave points | mean symmetry | mean fractal dimension |
| radius error | texture error | perimeter error | area error |
| smoothness error | compactness error | concavity error | concave points error |
| symmetry error | fractal dimension error | worst radius | worst texture |
| worst smoothness | worst compactness | worst concavity | worst concave points |
| | worst symmetry | worst fractal dimension | |

Predict Cancer

Patient has breast cancer

Activate Windows

Go to Settings to activate Windows.

Test Case-1:



BREAST CANCER PREDICTION

Breast cancer is the second most common cancer worldwide and the most commonly occurring malignancy in women. There is growing evidence that lifestyle factors, including diet, body weight and physical activity, may be associated with higher BC risk. However, the effect of dietary factors on BC recurrence and mortality is not clearly understood. Here, we provide an overview of the current evidence obtained from the PubMed databases in the last decade, assessing dietary patterns, as well as the consumption of specific food-stuffs/food-nutrients, in relation to BC incidence, recurrence and survival. Data from the published literature suggest that a healthy dietary pattern characterized by high intake of unrefined cereals, vegetables, fruit, nuts and olive oil, and a moderate/low consumption of saturated fatty acids and red meat, might improve overall survival after diagnosis of BC. BC patients undergoing chemotherapy and radiotherapy experience a variety of symptoms that worsen patient quality of life. Studies investigating nutritional interventions during BC treatment have shown that nutritional counselling and supplementation with some dietary constituents, such as EPA and DHA, might be useful in limiting drug-induced side effects, as well as in enhancing therapeutic efficacy. Therefore, nutritional intervention in BC patients may be considered an integral part of the multimodal therapeutic approach. However, further research utilizing dietary interventions in large clinical trials is required to definitively establish effective interventions in these patients, to improve long-term survival and quality of life.

Enter the value of tumor features

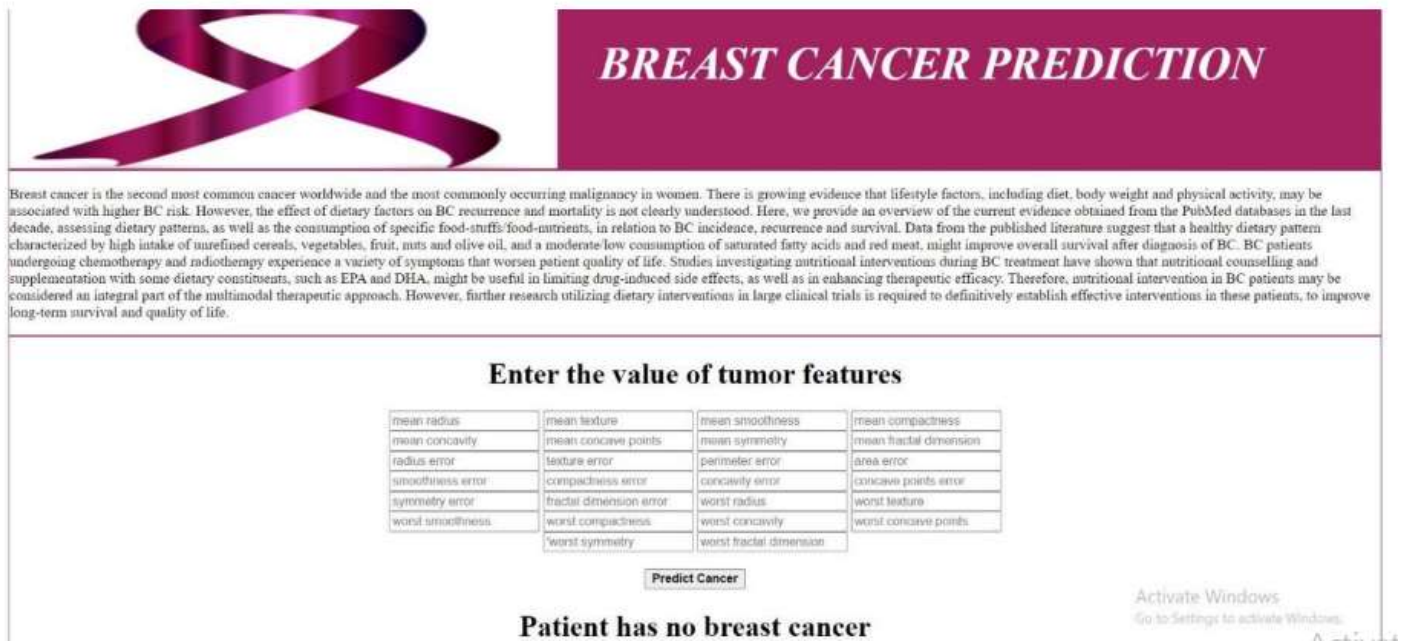
| | | | |
|--------|--------|-------|-------|
| 17.99 | 10.38 | 0.11 | 0.277 |
| 0.30 | 0.147 | 0.249 | 0.078 |
| 1.095 | 0.90 | 8.56 | 153.4 |
| 0.0063 | 0.049 | 0.053 | 0.015 |
| 0.03 | 0.006 | 25.38 | 17.33 |
| 0.1622 | 0.6656 | 0.711 | 0.26 |
| | 0.46 | 0.11 | |

Predict Cancer

Activate Windows

Go to Settings to activate Windows.

Has No Breast Cancer:



The image shows a software interface for breast cancer prediction. At the top left is a purple awareness ribbon. To its right, a purple banner contains the text "BREAST CANCER PREDICTION" in white. Below this is a paragraph of text explaining breast cancer and the study's focus on dietary factors. The main part of the interface is a form titled "Enter the value of tumor features" containing a grid of 16 input fields for various tumor characteristics. A "Predict Cancer" button is located below the grid. The output of the prediction is displayed as "Patient has no breast cancer".

BREAST CANCER PREDICTION

Breast cancer is the second most common cancer worldwide and the most commonly occurring malignancy in women. There is growing evidence that lifestyle factors, including diet, body weight and physical activity, may be associated with higher BC risk. However, the effect of dietary factors on BC recurrence and mortality is not clearly understood. Here, we provide an overview of the current evidence obtained from the PubMed databases in the last decade, assessing dietary patterns, as well as the consumption of specific food-stuffs/food-nutrients, in relation to BC incidence, recurrence and survival. Data from the published literature suggest that a healthy dietary pattern characterized by high intake of unrefined cereals, vegetables, fruit, nuts and olive oil, and a moderate-low consumption of saturated fatty acids and red meat, might improve overall survival after diagnosis of BC. BC patients undergoing chemotherapy and radiotherapy experience a variety of symptoms that worsen patient quality of life. Studies investigating nutritional interventions during BC treatment have shown that nutritional counselling and supplementation with some dietary constituents, such as EPA and DHA, might be useful in limiting drug-induced side effects, as well as in enhancing therapeutic efficacy. Therefore, nutritional intervention in BC patients may be considered an integral part of the multimodal therapeutic approach. However, further research utilizing dietary interventions in large clinical trials is required to definitively establish effective interventions in these patients, to improve long-term survival and quality of life.

Enter the value of tumor features

| | | | |
|------------------|-------------------------|-------------------------|------------------------|
| mean radius | mean texture | mean smoothness | mean compactness |
| mean concavity | mean concave points | mean symmetry | mean fractal dimension |
| radius error | texture error | perimeter error | area error |
| smoothness error | compactness error | concavity error | concave points error |
| symmetry error | fractal dimension error | worst radius | worst texture |
| worst smoothness | worst compactness | worst concavity | worst concave points |
| | worst symmetry | worst fractal dimension | |

Patient has no breast cancer

CONCLUSION:

We have used 6 algorithms like Decision Trees, Random Forests, Naive Bayes, SVC, KNN and Logistic Regression in-order to predict presence or absence of breast cancer using SMOTE Technique. The accuracy varies for different algorithms. The accuracy for Decision tree algorithm is 89.13%. The accuracy for Random Forest algorithm is 96.73%. The accuracy for Naive Bayes algorithm is 93.80%. The accuracy for KNN algorithm is 93.80%. The accuracy for Logistic Regression algorithm is 79.34%. The accuracy for SVM algorithm is 93.80%. The highest accuracy is given when we have used Random Forest algorithm using K-Fold Technique which is nearly 100.00%.

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