

DREXEL UNIVERSITY

CS499I

ADVANCED NEURAL NETWORKS

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# Facial Recognition With Artificial Neural Networks

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# 1 Datasets

**Yale Faces Database** This dataset contains 165 grayscale images in GIF format of 15 individuals with 11 images per person. There is one image per each of the following configurations: center-light, w/glasses, happy, left-light, w/no glasses, normal, right-light, sad, sleepy, surprised, and wink.

## 2 Testing Parameters

The following variants are tested for accuracy:

1. With and without a bias node at the input layer
2. With and without a bias node at the hidden layer
3. With and without standardizing features
4. With and without applying PCA to reduce the number of features to 95%

Empirical data was generated to optimize the following parameters:

1. Image size
2. Hidden layer size
3. Termination criteria

## 3 Baseline Accuracy

The baseline accuracy was created using the negative form of all variants with the exception of data standardization. The baseline parameters were as follows: 40 by 40 sized images, a hidden layer size of 20, and 1000 training iterations.

Input layer bias node	N
Hidden layer bias node	N
Standardization of features	Y
PCA applied	N
Testing Accuracy	0.800000

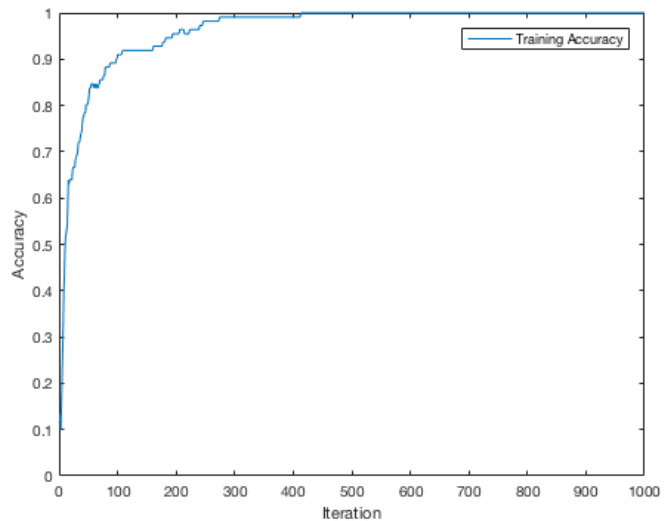


Table 1: Baseline Testing Accuracy

Figure 1: Baseline Training Accuracy

## 4 Variant Accuracy Testing

All variants were tested using 40 by 40 sized images, a hidden layer size of 20, and 1000 training iterations.

Input layer bias node	N
Hidden layer bias node	N
Standardization of features	N
PCA applied	N
Testing Accuracy	0.1455

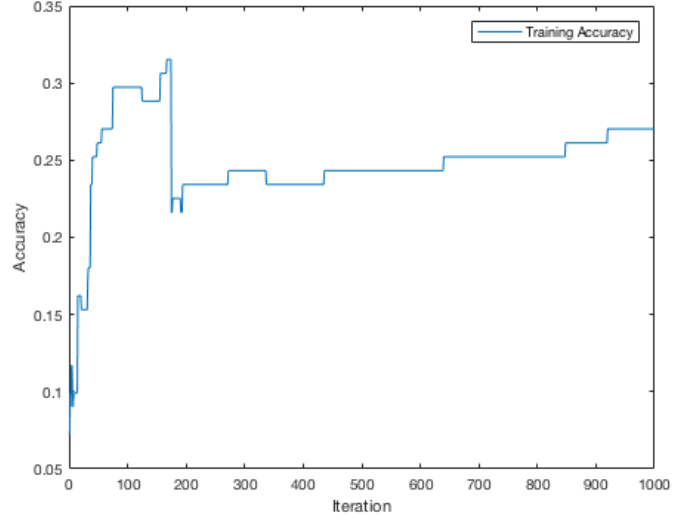


Table 2: NNNN Testing Accuracy

Figure 2: NNNN Training Accuracy

Input layer bias node	Y
Hidden layer bias node	N
Standardization of features	N
PCA applied	N
Testing Accuracy	0.2727

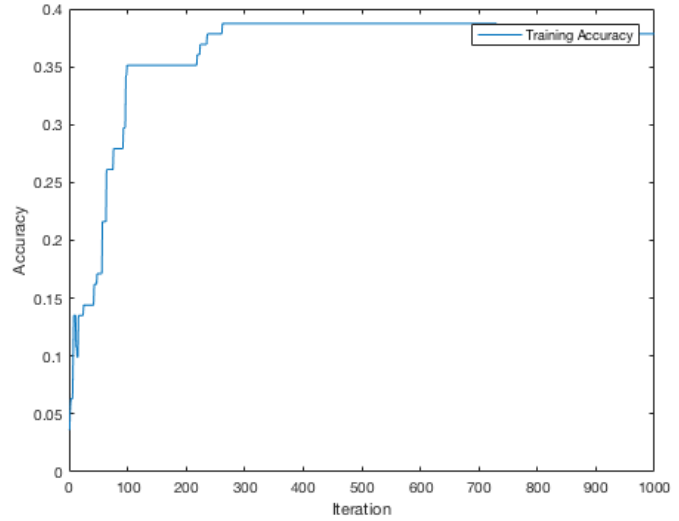


Table 3: YNNN Testing Accuracy

Figure 3: YNNN Training Accuracy

Input layer bias node	N
Hidden layer bias node	Y
Standardization of features	N
PCA applied	N
Testing Accuracy	0.1818

Table 4: NYNN Testing Accuracy

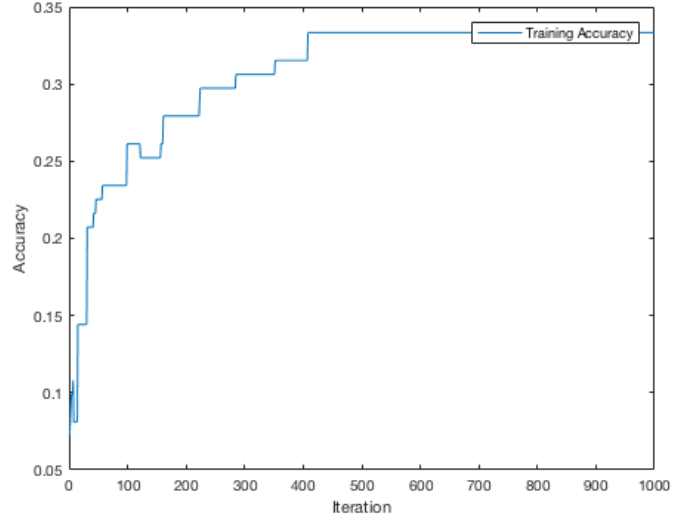


Figure 4: NYNN Training Accuracy

Input layer bias node	N
Hidden layer bias node	N
Standardization of features	N
PCA applied	Y
Testing Accuracy	0.1818

Table 5: NNNY Testing Accuracy

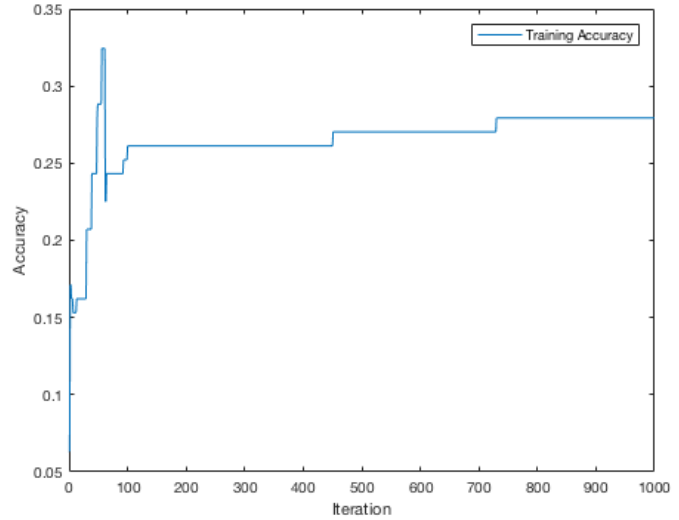


Figure 5: NNNY Training Accuracy

Input layer bias node	Y
Hidden layer bias node	Y
Standardization of features	N
PCA applied	N
Testing Accuracy	0.4000

Table 6: YYNN Testing Accuracy

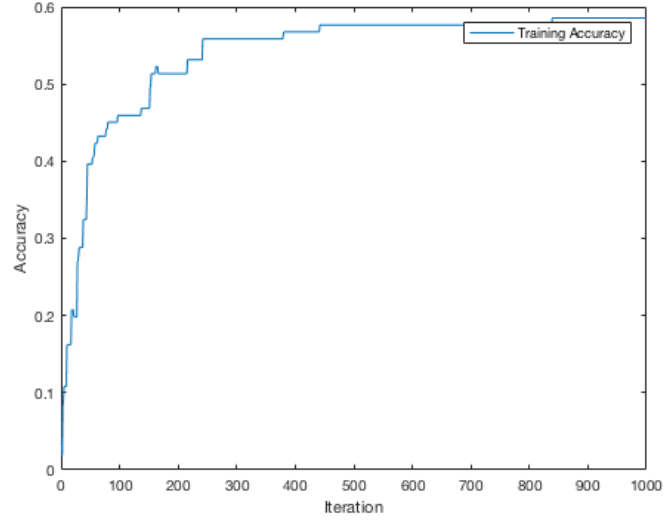


Figure 6: YYNN Training Accuracy

Input layer bias node	Y
Hidden layer bias node	N
Standardization of features	Y
PCA applied	N
Testing Accuracy	0.8182

Table 7: YNYN Testing Accuracy

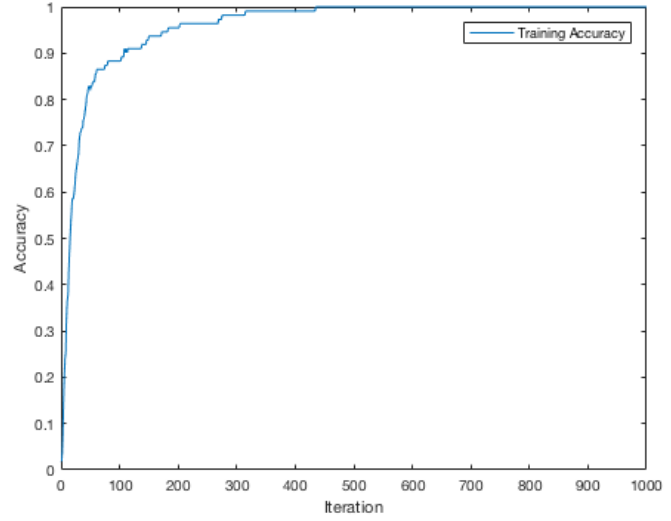


Figure 7: YNYN Training Accuracy

Input layer bias node	Y
Hidden layer bias node	N
Standardization of features	N
PCA applied	Y
Testing Accuracy	0.2364

Table 8: YNNY Testing Accuracy

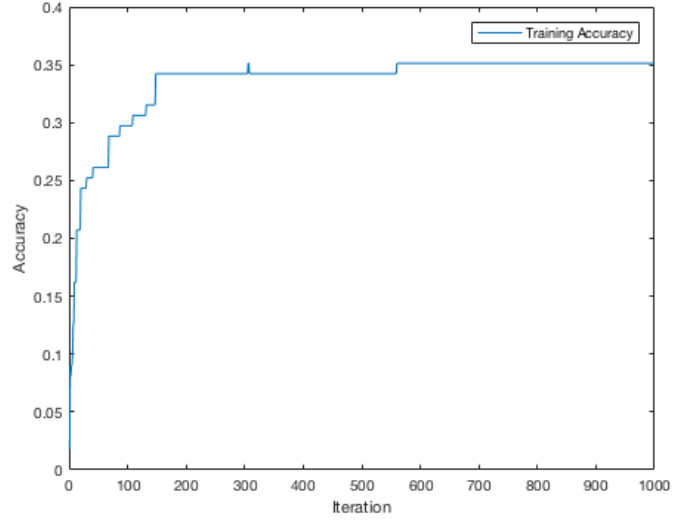


Figure 8: YNNY Training Accuracy

Input layer bias node	N
Hidden layer bias node	Y
Standardization of features	Y
PCA applied	N
Testing Accuracy	0.8182

Table 9: NYYN Testing Accuracy

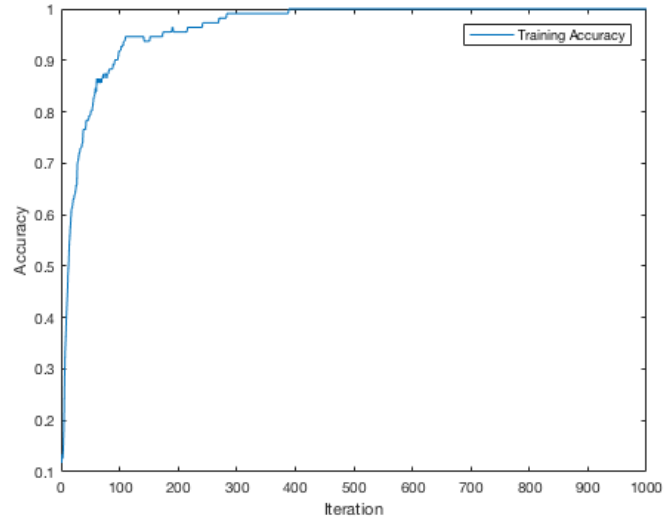


Figure 9: NYYN Training Accuracy

Input layer bias node	N
Hidden layer bias node	Y
Standardization of features	N
PCA applied	Y
Testing Accuracy	0.2364

Table 10: NYNY Testing Accuracy

accuracy\_imgs/NYNY\_training\_accuracy.png

Figure 10: NYNY Training Accuracy

Input layer bias node	N
Hidden layer bias node	N
Standardization of features	Y
PCA applied	Y
Testing Accuracy	0.8000

Table 11: NNYY Testing Accuracy

accuracy\_imgs/NNYY\_training\_accuracy.png

Figure 11: NNYY Training Accuracy

Input layer bias node	Y
Hidden layer bias node	Y
Standardization of features	Y
PCA applied	N
Testing Accuracy	0.8000

Table 12: YYYN Testing Accuracy

accuracy\_imgs/YYYN\_training\_accuracy.png

Figure 12: YYYN Training Accuracy

Input layer bias node	Y
Hidden layer bias node	Y
Standardization of features	N
PCA applied	Y
Testing Accuracy	0.2000

Table 13: YYNY Testing Accuracy

accuracy\_imgs/YYNY\_training\_accuracy.png

Figure 13: YYNY Training Accuracy



Input layer bias node	Y
Hidden layer bias node	N
Standardization of features	Y
PCA applied	Y
Testing Accuracy	0.8182

Table 14: YNYY Testing Accuracy

accuracy\_imgs/YNYY\_training\_accuracy.png

Figure 14: YNYY Training Accuracy

Input layer bias node	N
Hidden layer bias node	Y
Standardization of features	Y
PCA applied	Y
Testing Accuracy	0.8000

Table 15: NYYY Testing Accuracy

accuracy\_imgs/NYYY\_training\_accuracy.png

Figure 15: NYYY Training Accuracy

Input layer bias node	Y
Hidden layer bias node	Y
Standardization of features	Y
PCA applied	Y
Testing Accuracy	0.8182


Table 16: YYYY Testing Accuracy

accuracy\_imgs/YYYY\_training\_accuracy.png

Figure 16: YYYY Training Accuracy

## 5 Empirical Parameter Accuracy Testing

All empirical data was gathered using the following variant which had the highest accuracy from the variant testing:



YNNN\_training\_error.png

YNNN0.8181820.181818YNNN  
accuracy and testing

Figure 17: Plot of YNNN training error

1. Number of Training Iterations The number of training iterations was varied from 0 to 10,000 by 100. The number of hidden nodes was 20 and the image size was 40 by 40. The following is a plot of the accuracy as number of training iterations increases.



Figure 18: Plot of accuracy as number of training iterations increases

2. Number of Hidden Nodes The number of hidden nodes was varied from 0 to 1600 (the number of features) by 20. The number of training iterations was 1000 and the image size was 40 by 40. The following is a plot of the accuracy as number of hidden nodes increases.

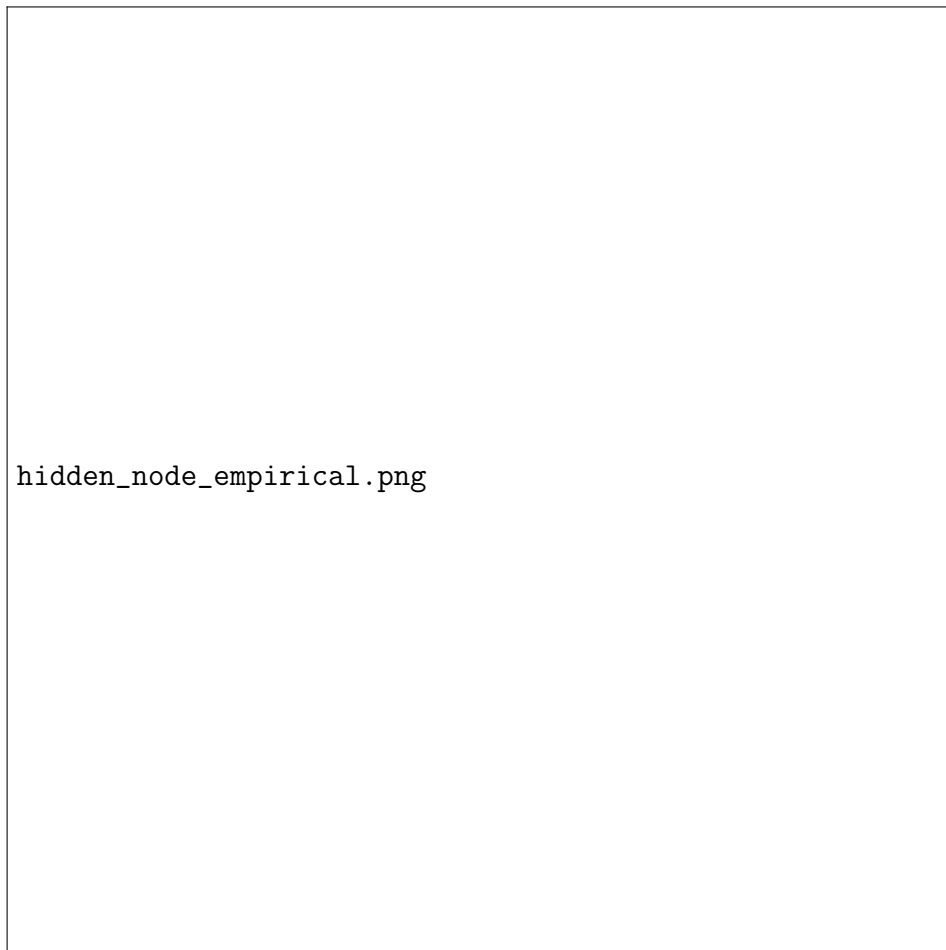


Figure 19: Plot of accuracy as number of hidden nodes increases

### 3. Image Size