## DREXEL UNIVERSITY

#### CS499I

ADVANCED NEURAL NETWORKS

# 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%
- 5. With and without applying LDA to maximize data separability

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        |
| LDA applied                 | N        |
| Accuracy                    | 0.800000 |
| Testing Error               | 0.200000 |

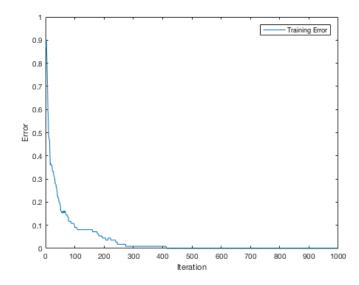


Table 1: Baseline accuracy and testing

Figure 1: Plot of baseline training error

## 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        |
| LDA applied                 | N        |
| Accuracy                    | 0.145455 |
| Testing Error               | 0.854545 |

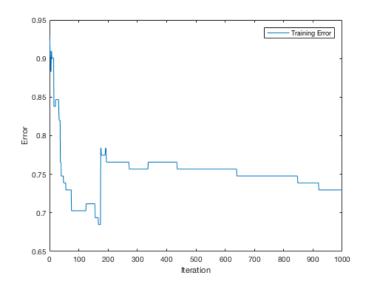


Table 2: NNNNN accuracy and testing

Figure 2: Plot of NNNNN training error

| Input layer bias node       | Y        |
|-----------------------------|----------|
| Hidden layer bias node      | N        |
| Standardization of features | N        |
| PCA applied                 | N        |
| LDA applied                 | N        |
| Accuracy                    | 0.272727 |
| Testing Error               | 0.727273 |

----- Training Error 0.95 0.9 0.85 8.0 0.75 0.7 0.65 0.6 100 200 300 400 500 600 700 800 900 1000 Iteration

Table 3: YNNNN accuracy and testing

Figure 3: Plot of YNNNN training error

| Input layer bias node       | N        |
|-----------------------------|----------|
| Hidden layer bias node      | Y        |
| Standardization of features | N        |
| PCA applied                 | N        |
| LDA applied                 | N        |
| Accuracy                    | 0.181818 |
| Testing Error               | 0.818182 |

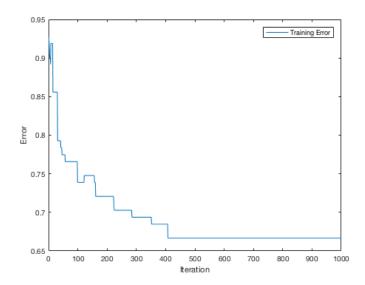


Table 4: NYNNN accuracy and testing

Figure 4: Plot of NYNNN training error

| Input layer bias node       | N        |
|-----------------------------|----------|
| Hidden layer bias node      | N        |
| Standardization of features | Y        |
| PCA applied                 | N        |
| LDA applied                 | N        |
| Accuracy                    | 0.800000 |
| Testing Error               | 0.200000 |

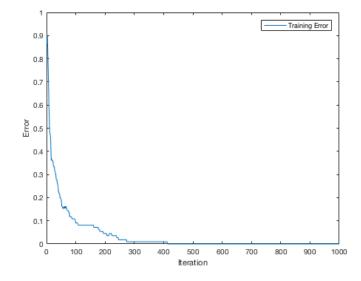


Table 5: NNYNN accuracy and testing

Figure 5: Plot of NNYNN training error

| Input layer bias node       | N        |
|-----------------------------|----------|
| Hidden layer bias node      | N        |
| Standardization of features | N        |
| PCA applied                 | Y        |
| LDA applied                 | N        |
| Accuracy                    | 0.254545 |
| Testing Error               | 0.745455 |

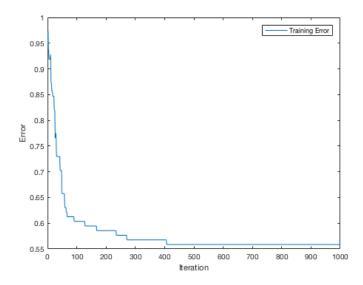


Table 6: NNNYN accuracy and testing

Figure 6: Plot of NNNYN training error

| Input layer bias node       | Y        |
|-----------------------------|----------|
| Hidden layer bias node      | Y        |
| Standardization of features | N        |
| PCA applied                 | N        |
| LDA applied                 | N        |
| Accuracy                    | 0.400000 |
| Testing Error               | 0.600000 |

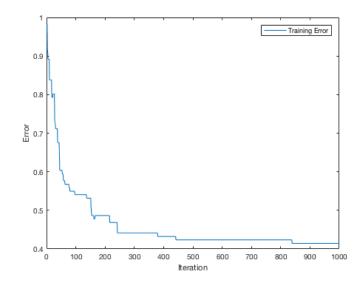


Table 7: YYNNN accuracy and testing

Figure 7: Plot of YYNNN training error

| Input layer bias node       | Y        |
|-----------------------------|----------|
| Hidden layer bias node      | N        |
| Standardization of features | Y        |
| PCA applied                 | N        |
| LDA applied                 | N        |
| Accuracy                    | 0.818182 |
| Testing Error               | 0.181818 |

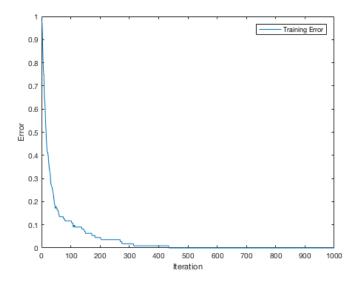


Table 8: YNYNN accuracy and testing

Figure 8: Plot of YNYNN training error

| Input layer bias node       | Y        |
|-----------------------------|----------|
| Hidden layer bias node      | N        |
| Standardization of features | N        |
| PCA applied                 | Y        |
| LDA applied                 | N        |
| Accuracy                    | 0.200000 |
| Testing Error               | 0.800000 |

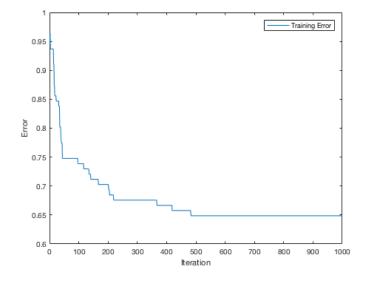


Table 9: YNNYN accuracy and testing

Figure 9: Plot of YNNYN training error

| Input layer bias node       | N        |
|-----------------------------|----------|
| Hidden layer bias node      | Y        |
| Standardization of features | Y        |
| PCA applied                 | N        |
| LDA applied                 | N        |
| Accuracy                    | 0.818182 |
| Testing Error               | 0.181818 |

Table 10: NYYNN accuracy and testing

Figure 10: Plot of NYYNN training error

| Input layer bias node       | N        |
|-----------------------------|----------|
| Hidden layer bias node      | Y        |
| Standardization of features | N        |
| PCA applied                 | Y        |
| LDA applied                 | N        |
| Accuracy                    | 0.254545 |
| Testing Error               | 0.745455 |

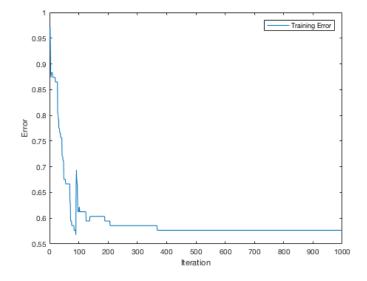


Table 11: NYNYN accuracy and testing

Figure 11: Plot of NYNYN training error

| Input layer bias node       | N        |
|-----------------------------|----------|
| Hidden layer bias node      | N        |
| Standardization of features | Y        |
| PCA applied                 | Y        |
| LDA applied                 | N        |
| Accuracy                    | 0.145455 |
| Testing Error               | 0.854545 |

0.9 0.8 0.7 0.6 0.4 0.3 0.2 0.1 0 100 200 300 400 500 600 700 800 900 1000 iteration

Table 12: NNYYN accuracy and testing

Figure 12: Plot of NNYYN training error

| Input layer bias node       | Y        |
|-----------------------------|----------|
| Hidden layer bias node      | Y        |
| Standardization of features | Y        |
| PCA applied                 | N        |
| LDA applied                 | N        |
| Accuracy                    | 0.800000 |
| Testing Error               | 0.200000 |

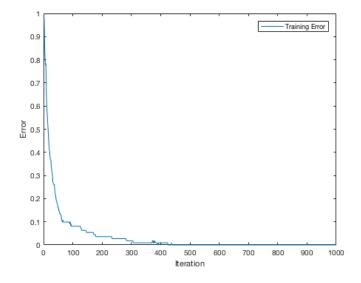


Table 13: YYYNN accuracy and testing  $\,$ 

Figure 13: Plot of YYYNN training error

| Input layer bias node       | Y        |
|-----------------------------|----------|
| Hidden layer bias node      | Y        |
| Standardization of features | N        |
| PCA applied                 | Y        |
| LDA applied                 | N        |
| Accuracy                    | 0.200000 |
| Testing Error               | 0.800000 |

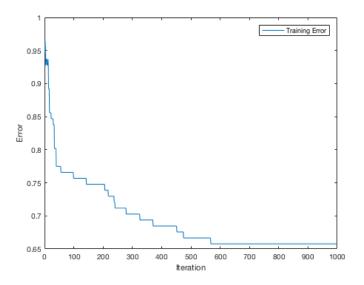


Table 14: YYNYN accuracy and testing

Figure 14: Plot of YYNYN training error

| Input layer bias node       | Y        |
|-----------------------------|----------|
| Hidden layer bias node      | N        |
| Standardization of features | Y        |
| PCA applied                 | Y        |
| LDA applied                 | N        |
| Accuracy                    | 0.181818 |
| Testing Error               | 0.818182 |

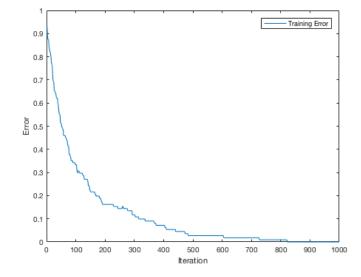


Table 15: YNYYN accuracy and testing

Figure 15: Plot of YNYYN training error

| Input layer bias node       | N        |
|-----------------------------|----------|
| Hidden layer bias node      | Y        |
| Standardization of features | Y        |
| PCA applied                 | Y        |
| LDA applied                 | N        |
| Accuracy                    | 0.145455 |
| Testing Error               | 0.854545 |

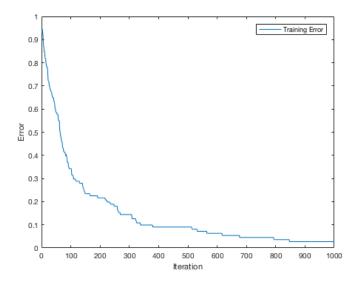


Table 16: NYYYN accuracy and testing

Figure 16: Plot of NYYYN training error

| Input layer bias node       | Y        |
|-----------------------------|----------|
| Hidden layer bias node      | Y        |
| Standardization of features | Y        |
| PCA applied                 | Y        |
| LDA applied                 | N        |
| Accuracy                    | 0.181818 |
| Testing Error               | 0.818182 |

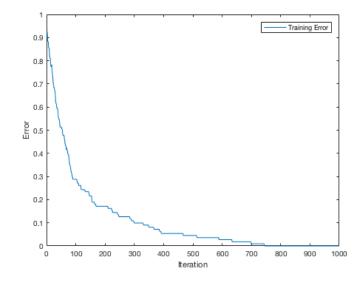


Table 17: YYYYN accuracy and testing

Figure 17: Plot of YYYYN training error