

CHAPTER IV

EXPERIMENTAL RESULTS

The proposed algorithm are tested with four test sets. Each test set composes of two classes of two dimensional input data. The first test set is shown in Fig. 3.3. Each center vector is at non-optimal location. In Fig. 3.4, the center is adjusted to the position that achieves a higher degree of fault immunization. Table 4.1 shows the values obtained from the test: hidden unit number, initial immunization degree and final immunization degree.

| Hidden unit No. | Initial immunization degree (F_k) (%) | Final immunization degree (F_k) (%) |
|-----------------------------|---|---|
| 1 | 62.987779 | 82.304011 |
| 2 | 80.235047 | 85.064070 |
| Average immunization degree | 71.611413 | 83.684041 |

Table 4.1: The comparison of the improvement of the immunization degree for test set 1.

The total increase of immunization degree is 12.072628% with the standard deviations (SD) of the hidden units is 0.072436.

The second test set contains two classes that are not separable by linear or quadratic

discrimination functions. The distributions of the classes are described by an equation with certain boundary constraints shown in the following.

$$(y - y_0)^2 = \frac{b}{a}(x - x_0)^2 + G(0, c), \text{ with } x_u \leq x \leq x_v, \quad (4.1)$$

where (x_0, y_0) , (x_u, y_v) and (a, b, c) are three sets of parameter that determine the location and shape of the sample distribution. $G(0, c)$ is a Gaussian noise function with a mean value equal to zero and a variance equal to a constant value c . The snapshot of the learning process and the result of relocating the center vector for each test sets are illustrated in Tables 4.2, 4.3, and 4.4. For the Table 4.2(c), Table 4.3(c) and Table 4.4(c), the ellipses represent the hidden units which are at the non-optimal location, and the dotted ellipses represent the hidden units which are at the positions that achieve the higher immunization degree.

The third test set involves the training samples in two classes that are distributed in the way that are separable evenly by quadratic discriminate functions. The samples are described by system of three sine functions in the form of

$$y = \sin(x - x_0) + G(0, c) \quad (4.2)$$

where (x_0, y_0) , (x_u, y_v) and (a, b, c) are three sets of parameters that determine the location and shape of the sample distribution. $G(0, c)$ is a Gaussian noise function with a mean value equal to zero and a variance equal to a constant value c . The samples with different c are shown in Tables 4.5, 4.6 and 4.7. For the Table 4.5(c), Table 4.6(c), and Table 4.7(c), the ellipses represent the hidden units which are at the non-optimal location, and the dotted ellipses represent the hidden units which are at the positions that achieve the higher immunization degree.

The fourth test set contain two classes distributed in a ring-shaped region. The distributions are described by a system of three quadratic equations in the form of

$$(y - y_0)^2 = \frac{b}{a}(x - x_0)^2 + G(0, c) \quad (4.3)$$

where the parameters are the same as those that are use in test set 1. The sample sets with different $G(0, c)$ values are shown in Tables 4.8, 4.9 and 4.10. For the Table 4.8(c), Table 4.9(c) and Table 4.10(c) the ellipses represent the hidden units which are at the non-optimal location, and the dotted ellipses represent the hidden units which are at the positions that achieve the higher immunization degree.

Table. 4.11 compares the improvement of the immunization degree of the test sets and shows the values obtained from the tests: number of used hidden unit, average epochs, correct classification rate obtained from this thesis and [5] before fault immunization. In test set 3, the comparison is not applicable because the sinusoidal curves in this thesis and those in [5] are different in characteristics.

Table 4.12 compares the improvement of the immunization degree of the test sets and shows the values obtained from the tests: number of used hidden unit, initial immunization degree (F_k), final immunization degree (F_k), increased immunization degree (F_k) and the standard deviations (SD) of the hidden units.

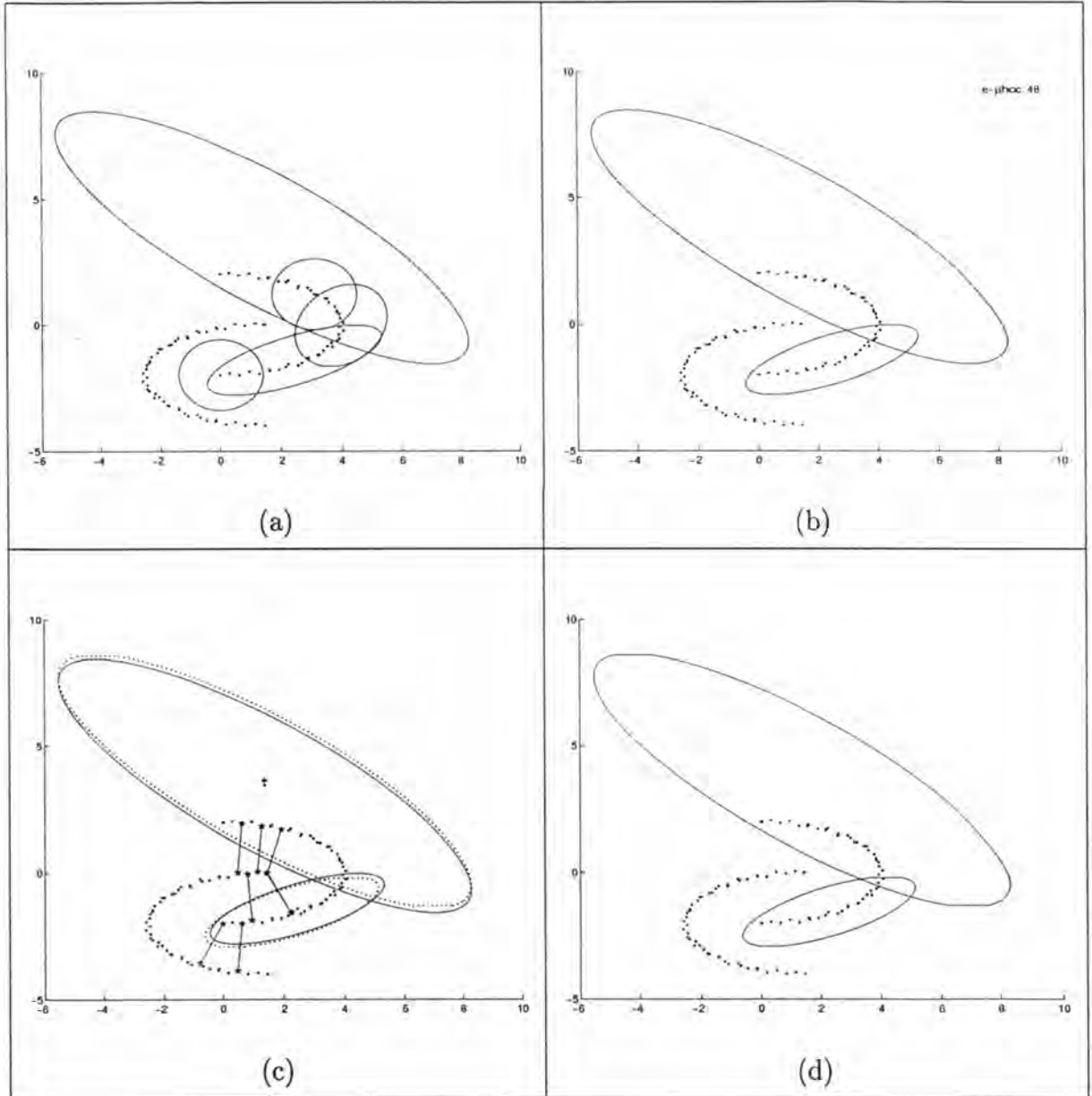


Table 4.2: The results of test set 2.1 (half circle distributions): (a) The result before pruning (b) The result after pruning (c) All the nearest data vectors pairs (d) The result after fault immunization.

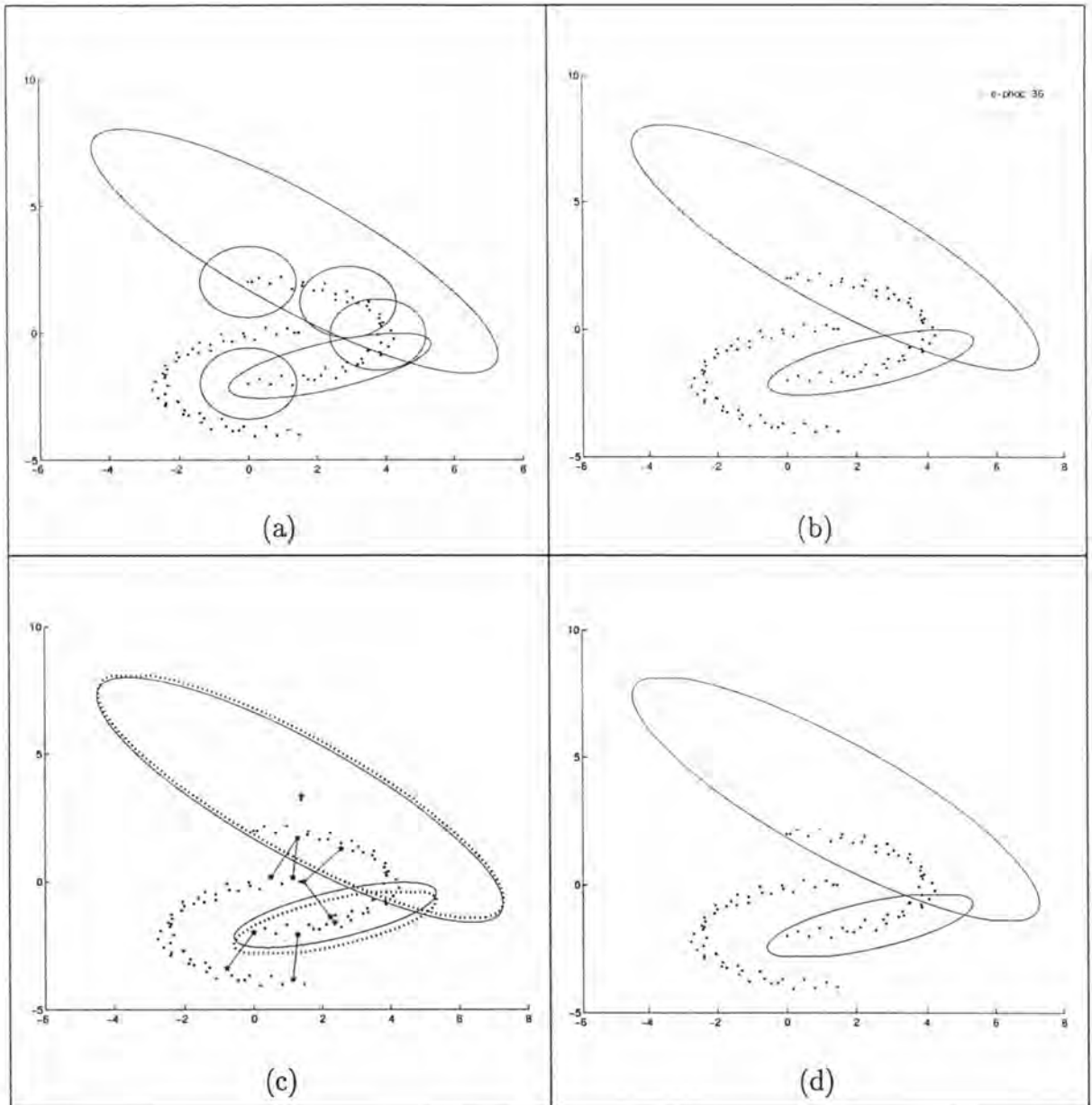


Table 4.3: The results of test set 2.2 (half circle distributions): (a) The result before pruning (b) The result after pruning (c) All the nearest data vectors pairs (d) The result after fault immunization.

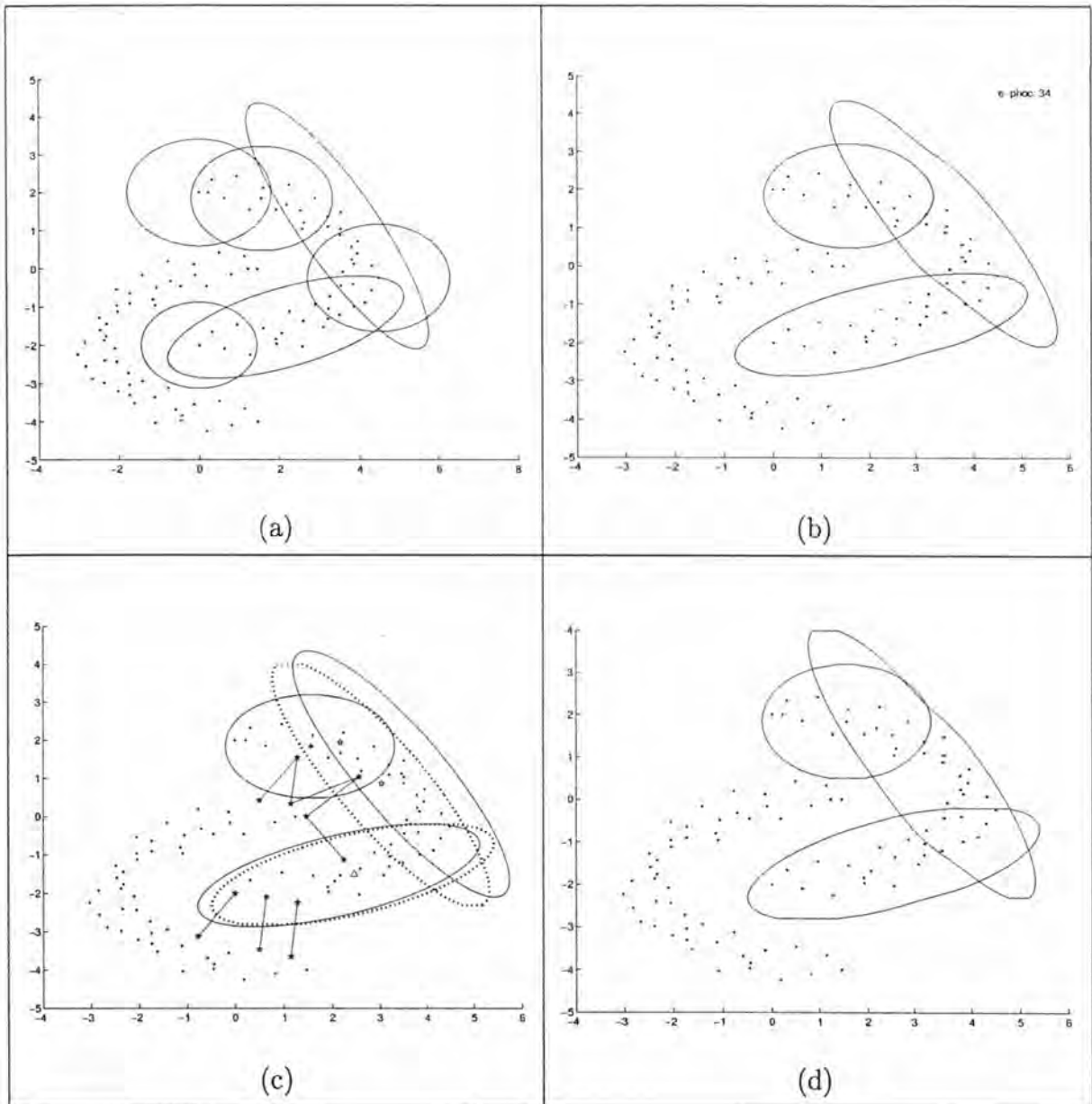


Table 4.4: The results of test set 2.3 (half circle distributions): (a) The result before pruning (b) The result after pruning (c) All the nearest data vectors pairs (d) The result after fault immunization.

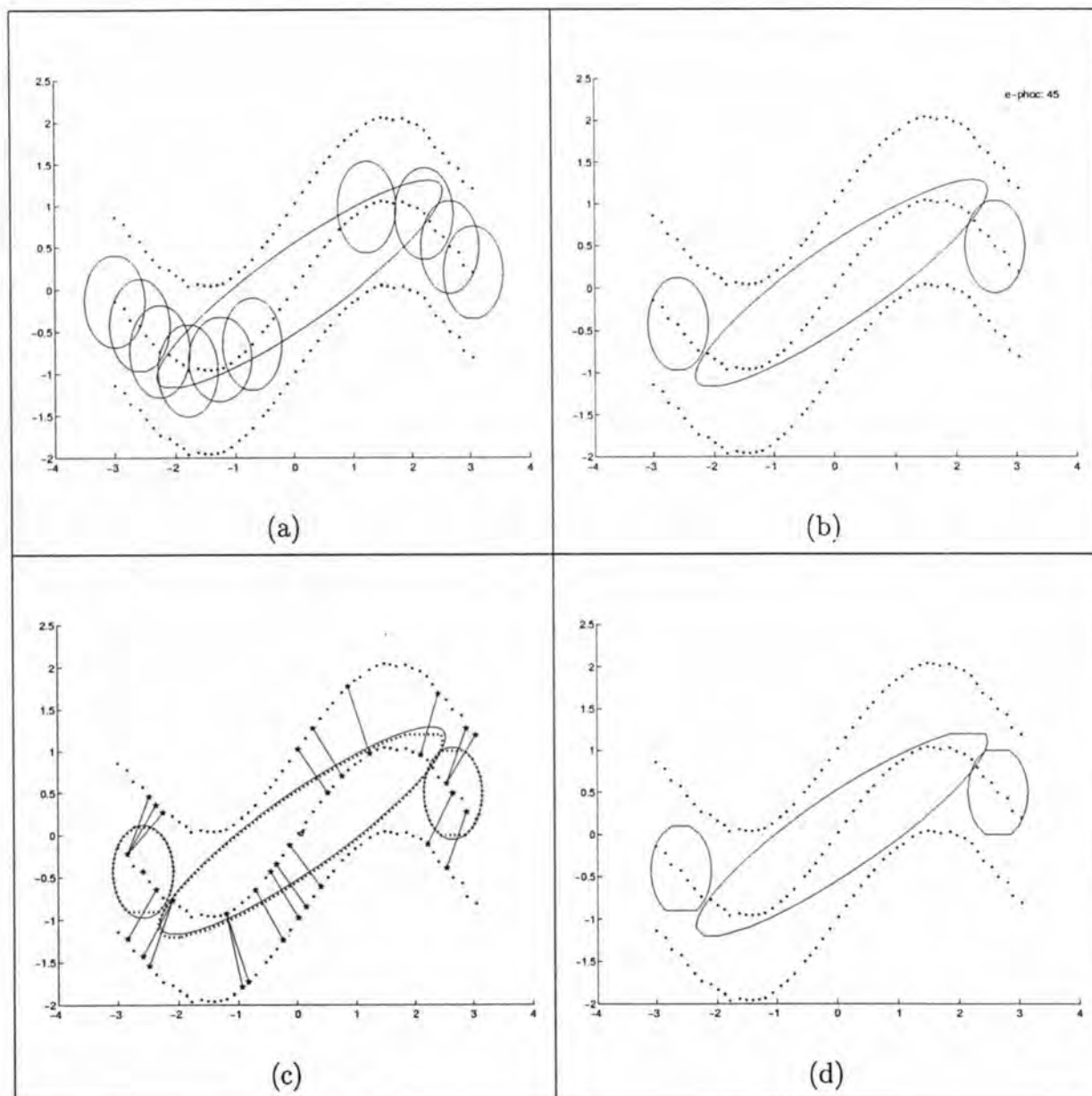


Table 4.5: The results of test set 3.1 (different distribution sinusoidal curve): (a) The result before pruning (b) The result after pruning (c) All the nearest data vectors pairs (d) The result after fault immunization.

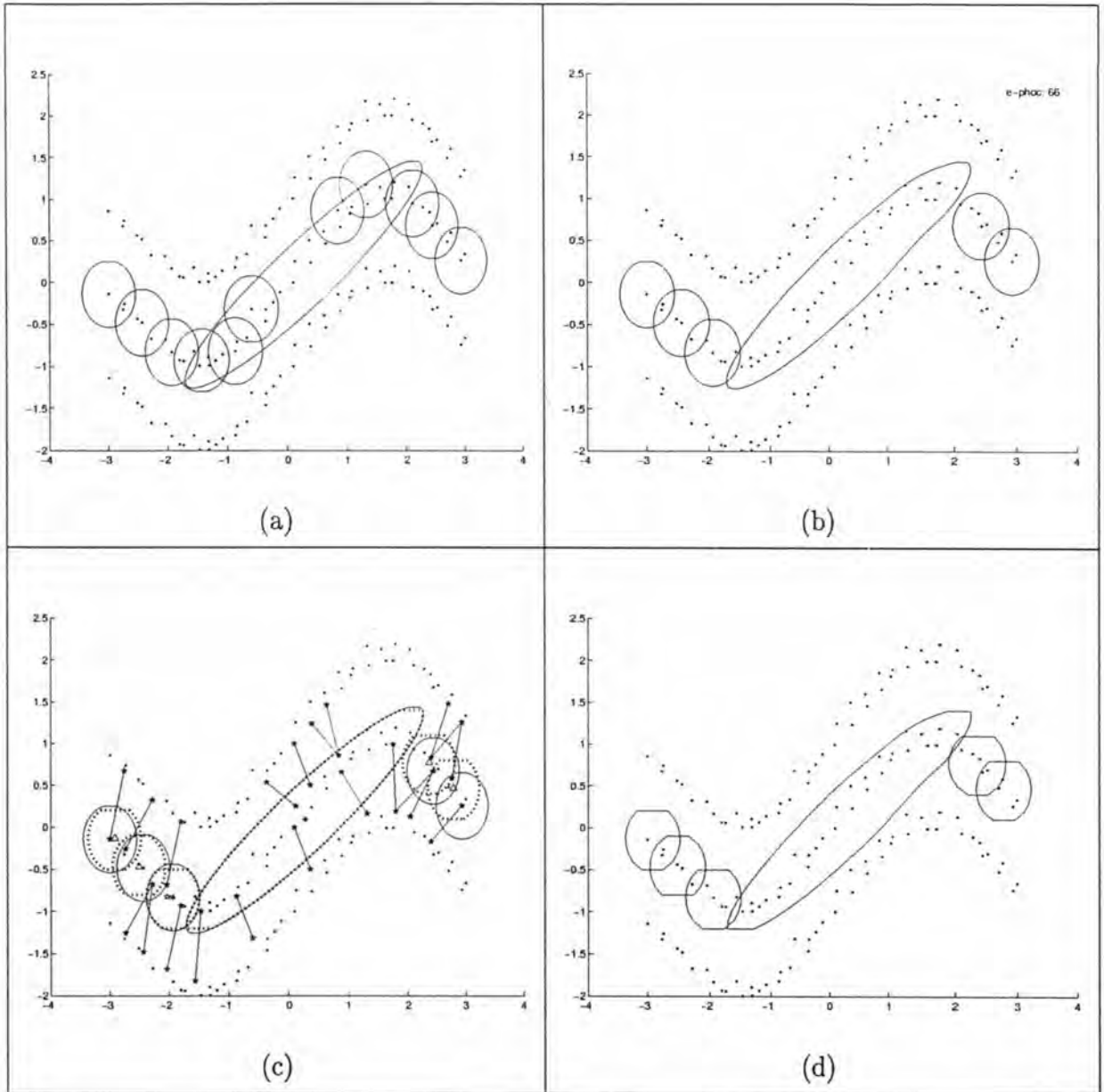


Table 4.6: The results of test set 3.2 (different distribution sinusoidal curve): (a) The result before pruning (b) The result after pruning (c) All the nearest data vectors pairs (d) The result after fault immunization.

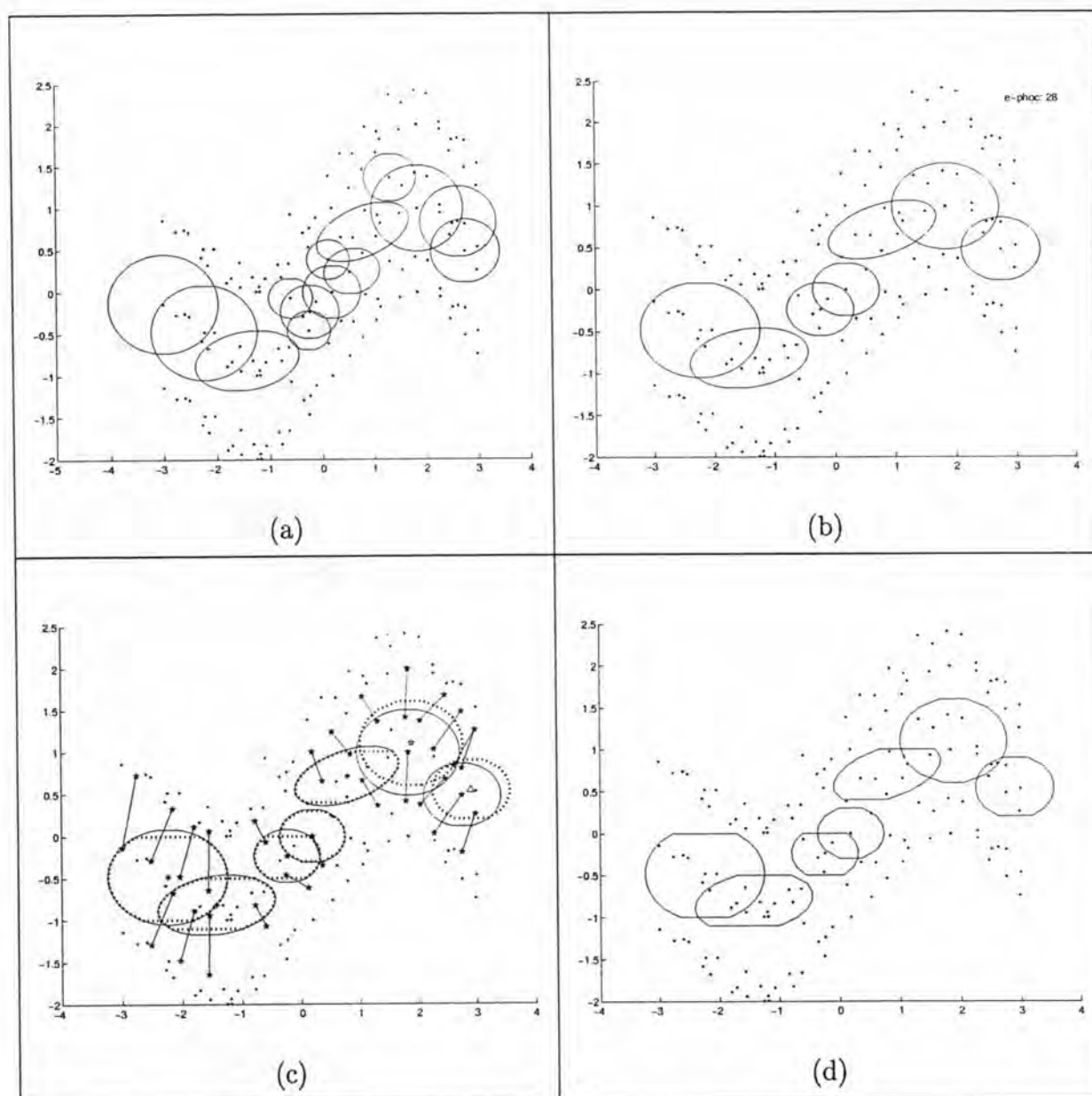


Table 4.7: The results of test set 3.3 (different distribution sinusoidal curve): (a) The result before pruning (b) The result after pruning (c) All the nearest data vectors pairs (d) The result after fault immunization.

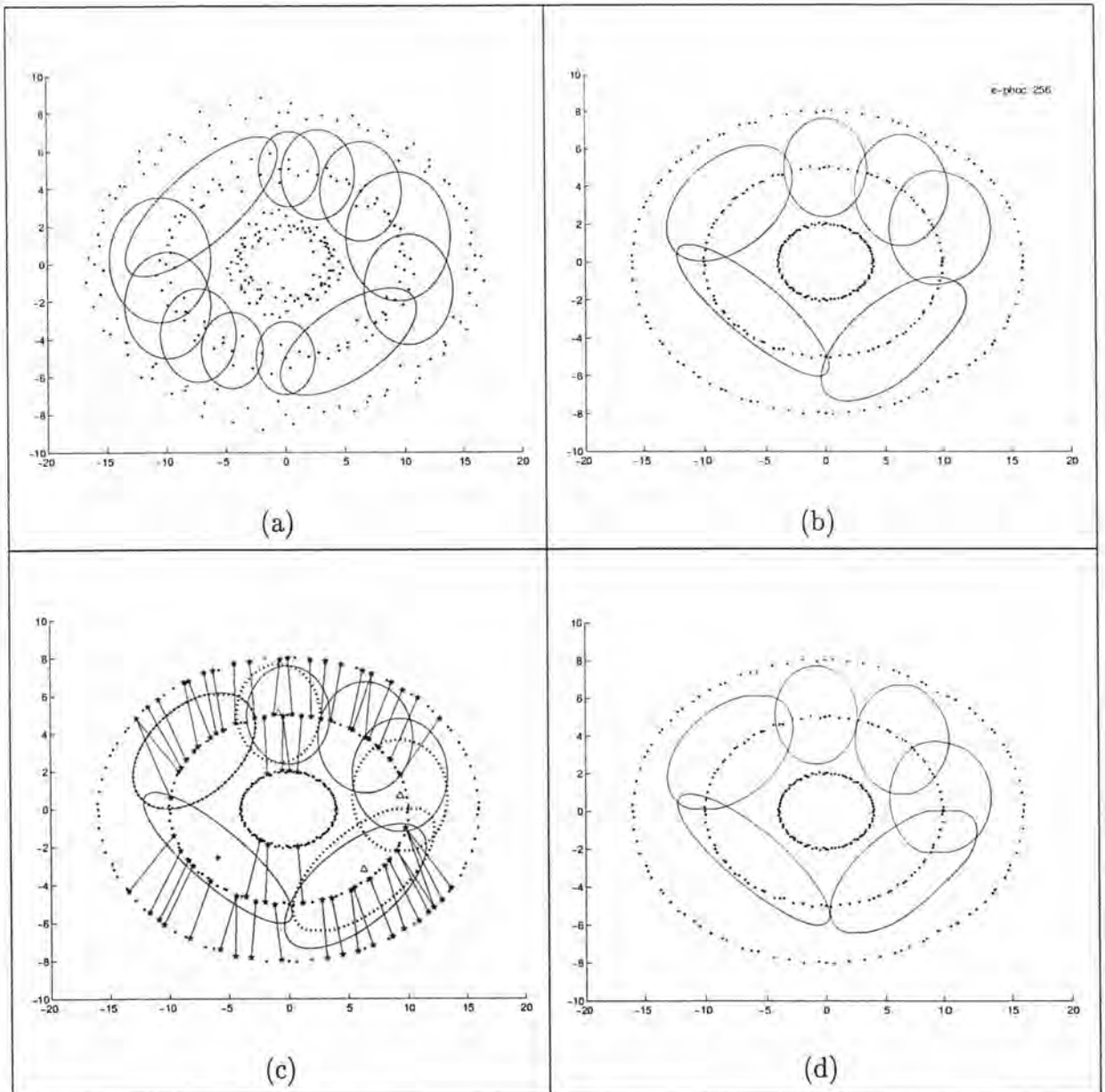


Table 4.8: The results of test set 4.1 (ring-shaped distributions): (a) The result before pruning (b) The result after pruning (c) All the nearest data vectors pairs (d) The result after fault immunization.

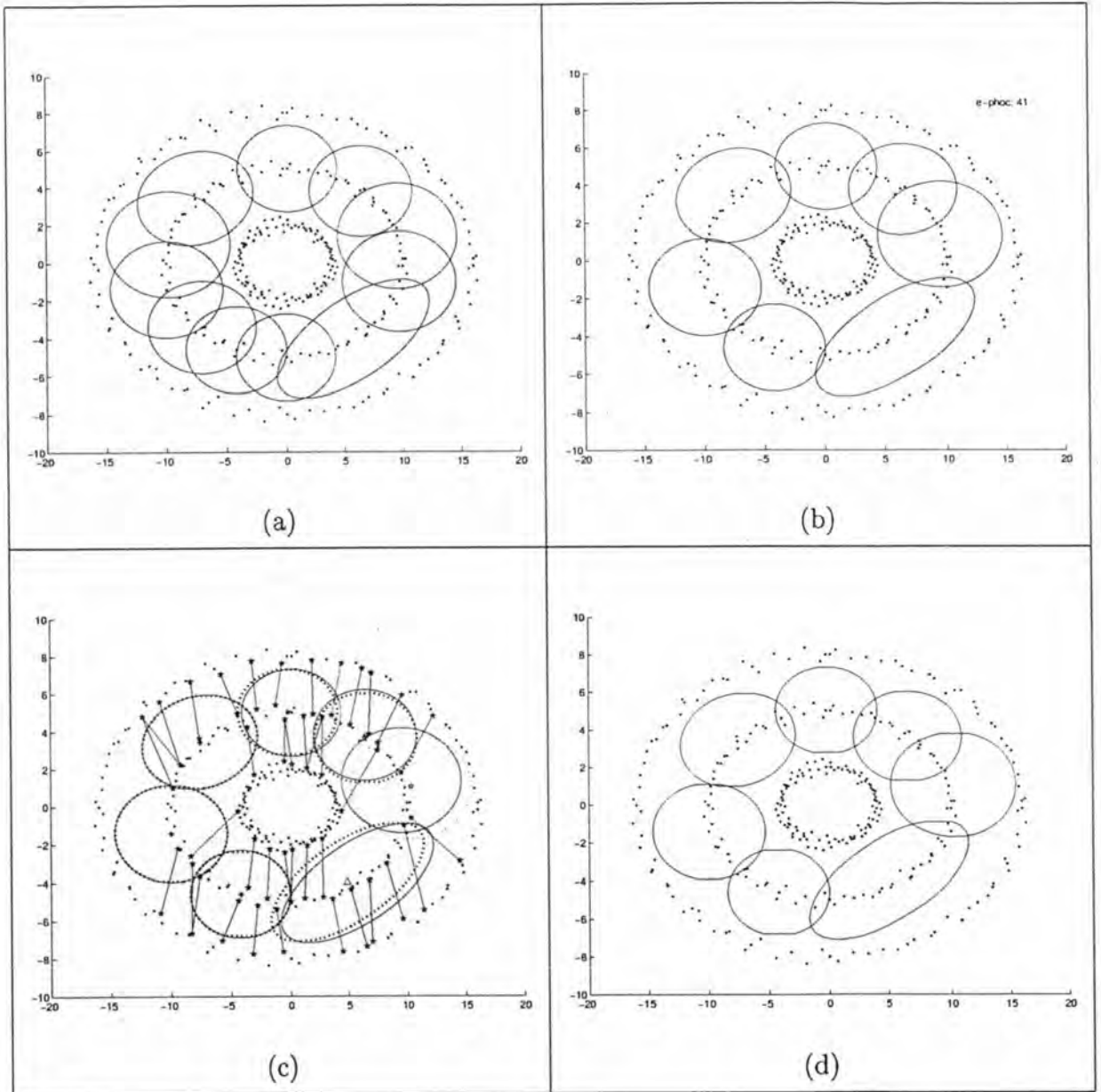


Table 4.9: The results of test set 4.2 (ring-shaped distributions): (a) The result before pruning. (b) The result after pruning. (c) All the nearest data vectors pairs. (d) The result after fault immunization.

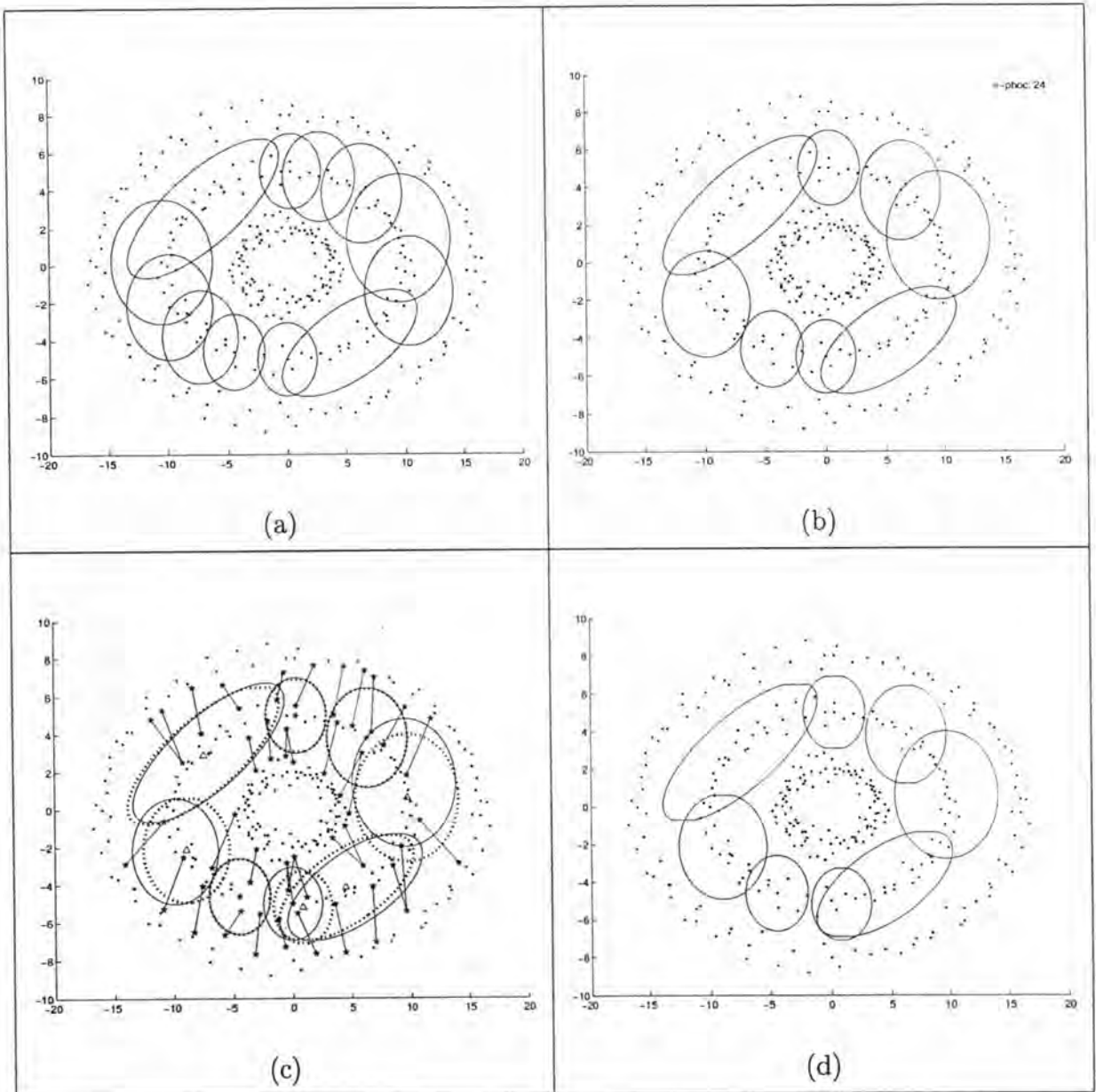


Table 4.10: The results of test set 4.3 (ring-shaped distributions): (a) The result before pruning (b) The result after pruning (c) All the nearest data vectors pairs (d) The result after fault immunization.

| Test set | Number of hidden units | Number of hidden units[5] | Epochs | Epochs [5] | Correct classification rate (%) | Correct classification rate[5] (%) |
|----------|------------------------|---------------------------|--------|------------|---------------------------------|------------------------------------|
| 2.1 | 2 | 3 | 48 | 61 | 95.00 | 94.20 |
| 2.2 | 2 | 4 | 36 | 73 | 95.00 | 94.68 |
| 2.3 | 3 | 4 | 34 | 123 | 99.00 | 94.97 |
| 3.1 | 3 | - | 45 | - | 95.80 | - |
| 3.2 | 6 | - | 66 | - | 95.48 | - |
| 3.3 | 7 | - | 28 | - | 89.00 | - |
| 4.1 | 6 | 7 | 256 | 230 | 100.00 | 94.17 |
| 4.2 | 7 | 7 | 41 | 384 | 94.00 | 95.00 |
| 4.3 | 8 | 8 | 24 | 579 | 95.00 | 94.03 |

Table 4.11: The comparison of the results (number of hidden units, average epochs and percentage of correct classification rate) obtained from this thesis and [5] before fault immunization.

| Test set | Number of hidden units | Initial immunization degree (F_k) (%) | Final immunization degree (F_k) (%) | Increase immunization degree (F_k) (%) | SD |
|----------|------------------------|---|---|--|----------|
| 2.1 | 2 | 54.364500 | 63.747500 | 9.383000 | 0.015184 |
| 2.2 | 2 | 54.722200 | 71.699050 | 16.97690 | 0.089551 |
| 2.3 | 3 | 40.722333 | 66.525867 | 25.80353 | 0.260940 |
| 3.1 | 3 | 54.159600 | 56.052567 | 1.892967 | 0.025239 |
| 3.2 | 6 | 47.683817 | 50.714783 | 3.030950 | 0.036309 |
| 3.3 | 7 | 49.886343 | 54.958829 | 5.072486 | 0.079302 |
| 4.1 | 6 | 39.787300 | 48.125033 | 8.337733 | 0.083377 |
| 4.2 | 7 | 46.148757 | 55.152014 | 9.003257 | 0.180528 |
| 4.3 | 8 | 47.324038 | 55.407650 | 8.083625 | 0.077068 |

Table 4.12: The comparison of the improvement of the immunization degree for each test set.