AI*IA 2003
Tutorial on Fusion of Multiple Pattern Classifiers by F. Roli

SELECTED REFERENCES

Note: References in boldface have been mentioned during the Tutorial. Additional papers on multiple pattern classifiers and some of these references can be downloaded from www.diee.unica.it/informatica/prag

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