



Unsupervised Learning

Foundations of Neural Computation

Edited by

Geoffrey Hinton

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Unsupervised Learning

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CONTENTS

Introduction	vii
1 Unsupervised Learning <i>H. B. Barlow</i>	1
2 Local Synaptic Learning Rules Suffice to Maximize Mutual Information in a Linear Network <i>Ralph Linsker</i>	19
3 Convergent Algorithm for Sensory Receptive Field Development <i>Joseph J. Atick and A. Norman Redlich</i>	31
4 Emergence of Position-Independent Detectors of Sense of Rotation and Dilation with Hebbian Learning: An Analysis <i>Kechen Zhang, Martin I. Sereno, and Margaret E. Sereno</i>	47
5 Learning Invariance from Transformation Sequences <i>Peter Földiák</i>	63
6 Learning Perceptually Salient Visual Parameters Using Spatiotemporal Smoothness Constraints <i>James V. Stone</i>	71
7 What Is the Goal of Sensory Coding? <i>David J. Field</i>	101
8 An Information-Maximization Approach to Blind Separation and Blind Deconvolution <i>Anthony J. Bell and Terrence J. Sejnowski</i>	145
9 Natural Gradient Works Efficiently in Learning <i>Shun-ichi Amari</i>	177
10 A Fast Fixed-Point Algorithm for Independent Component Analysis <i>Aapo Hyvärinen and Erkki Oja</i>	203
11 Feature Extraction Using an Unsupervised Neural Network <i>Nathan Intrator</i>	213
12 Learning Mixture Models of Spatial Coherence <i>Suzanna Becker and Geoffrey E. Hinton</i>	223
13 Bayesian Self-Organization Driven by Prior Probability Distributions <i>Alan L. Yuille, Stelios M. Smirnakis, and Lei Xu</i>	235
14 Finding Minimum Entropy Codes <i>H. B. Barlow, T.P. Kaushal, and G. J. Mitchison</i>	249
15 Learning Population Codes by Minimizing Description Length <i>Richard S. Zemel and Geoffrey E. Hinton</i>	261

16	The Helmholtz Machine <i>Peter Dayan, Geoffrey E. Hinton, Radford M. Neal, and Richard S. Zemel</i>	277
17	Factor Analysis Using Delta-Rule Wake-Sleep Learning <i>Radford M. Neal and Peter Dayan</i>	293
18	Dimension Reduction by Local Principal Component Analysis <i>Nandakishore Kambhatla and Todd K. Leen</i>	317
19	A Resource-Allocating Network for Function Interpolation <i>John Platt</i>	341
20	Learning with Preknowledge: Clustering with Point and Graph Matching Distance Measures <i>Steven Gold, Anand Rangarajan, and Eric Mjolsness</i>	355
21	Learning to Generalize from Single Examples in the Dynamic Link Architecture <i>Wolfgang Konen and Christoph von der Malsburg</i>	373
	Index	391

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Foundations of Neural Computation

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Since its founding in 1989 by Terrence J. Sejnowski, *Neural Computation* has become the leading journal in the field. *Foundations of Neural Computation* collects, by topic, the most significant papers that have appeared in the journal over the past ten years.

This volume, on unsupervised learning algorithms, focuses on neural network learning algorithms that do not require an explicit teacher. The goal of unsupervised learning is to extract an efficient internal representation of the statistical structure implicit in the inputs. These algorithms provide insights into the development of the cerebral cortex and implicit learning in humans. They are also of interest to engineers working in areas such as computer vision and speech recognition who seek efficient representations of raw input data.

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