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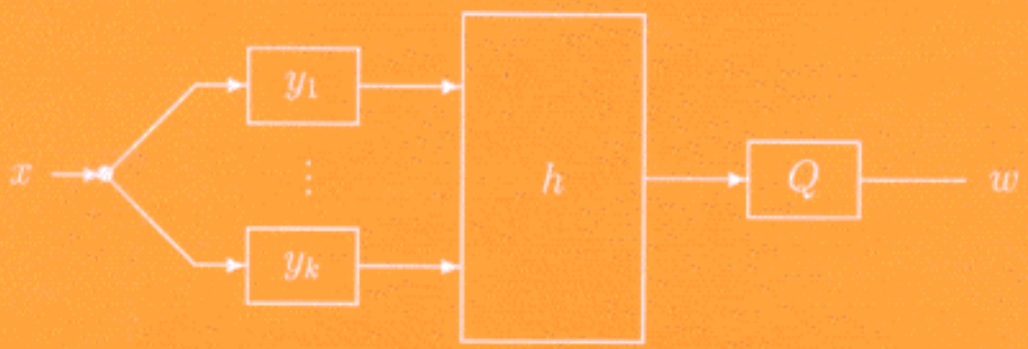
Simon Haykin, Series Editor

Nonlinear Dynamical Systems

Feedforward Neural Network Perspectives



IRWIN W. SANDBERG, JAMES T. LO,
CRAIG L. FANCOURT, JOSE C. PRINCIPE,
SHIGERU KATAGIRI, and SIMON HAYKIN

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