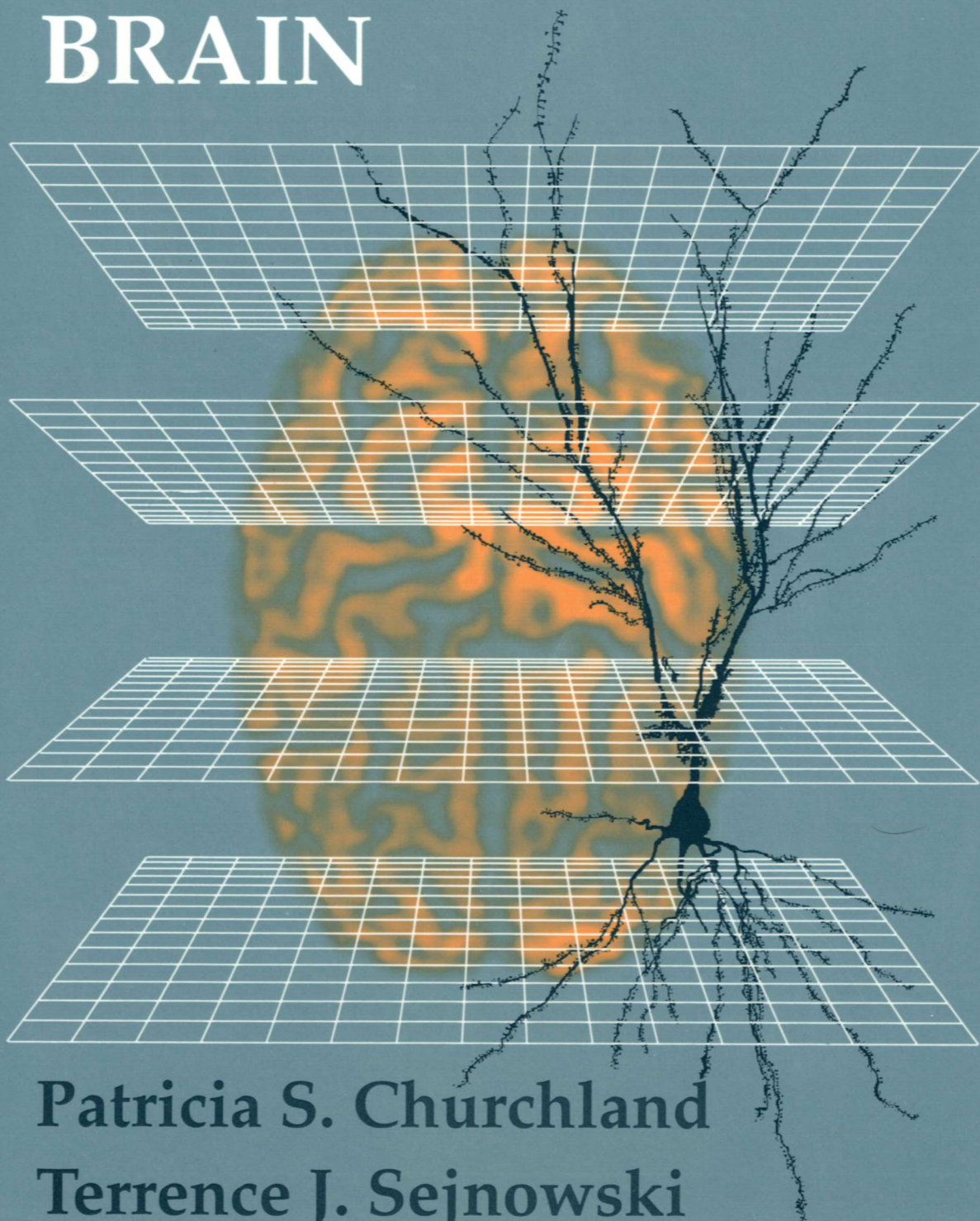


THE COMPUTATIONAL BRAIN



Patricia S. Churchland
Terrence J. Sejnowski

The Computational Brain

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Patricia S. Churchland and Terrence J. Sejnowski

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"There is no equivalent to *The Computational Brain*—a unique synthesis of the fast expanding field of neural models. A rewarding experience to read." — J. P. Changeux, Institut Pasteur

"*The Computational Brain* describes the new style of brain-like computation, based on neural nets, as it applies to biological systems. It is written in a lively, readable style, assisted by many illustrations, yet it does not evade the many intellectual and computational problems involved. It is unique in viewing the subject from such a wide perspective while presenting detailed examples to illustrate the present state of the art. I strongly recommend it to all those interested in how nervous systems work, including the behavior of our own brain." —Francis Crick, The Salk Institute

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