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and the can help us understand why they are so different from	nonliving matter?

The and gene names are avoided, although detailed descriptions of several well-studied associat systems are presented invotder to demonstrate the principles. This book presents the path into systems biology based on mathematical principles, with less emphasis on performental technology. Other directions can be found in the sources listed at the end of