



*Edited by Evgeny Katz*

# **Biomolecular Information Processing**

From Logic Systems to Smart Sensors and Actuators



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## The Editor

**Prof. Dr. Evgeny Katz**  
Clarkson University  
Department of Chemistry  
and Biomolecular Science  
8, Clarkson Avenue  
Potsdam, NY 13699-5810  
USA

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