



*Kenji Doya's Publications*

### **Metalearning and Neuromodulators**

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Schweighofer N., Doya K. (2003). Meta-learning of reinforcement learning. Neural Networks, 16, 5–9.

Schweighofer N., Doya K. (2002). A biologically plausible computational model of meta-learning in reinforcement learning. 32nd Annual Meeting, Society for Neuroscience, Orlando, USA.

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cortico–basal ganglia loops. *Nature Neuroscience*, 7(8), 887–893.

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### **Specialization and Integration of Brain Areas**

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### **Reinforcement Learning**

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## **Cyber Rodent**

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## **Learning to Stand Up**

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## **Multiple Models**

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## **Cerebellum**

Kuroda S., Yamamoto K., Miyamoto H., Doya K., Kawato M. (2001). Statistical characteristics of climbing fiber spikes necessary for efficient cerebellar learning. *Biological Cybernetics*, 84, 183–192.

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### **Cortical Dynamics**

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## **Neural Oscillators**

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