Applied Neural Networks with TensorFlow 2

API Oriented Deep Learning with Python

Orhan Gazi Yalçın

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Applied Neural Networks with TensorFlow 2: API Oriented Deep Learning with Python

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I dedicate this book to my overcurious dad, Lutfi – who kept sneaking into the study room to see how far I was into the book – and to my mom, Ayşe, for always supporting and encouraging me.

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Orhan G. Yalçın

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About the Author

Orhan Gazi Yalçın is a joint PhD candidate at the University of Bologna and the Polytechnic University of Madrid. After completing his double major in business and law, he began his career in Istanbul, working for a city law firm, Allen & Overy, and a global entrepreneurship network, Endeavor. During his academic and professional career, he taught himself programming and excelled in machine learning. He currently conducts research on hotly debated law and AI topics such as explainable artificial intelligence and the right to explanation by combining his technical and legal skills. In his spare time, he enjoys free diving, swimming, exercising, as well as discovering new countries, cultures, and cuisines.

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