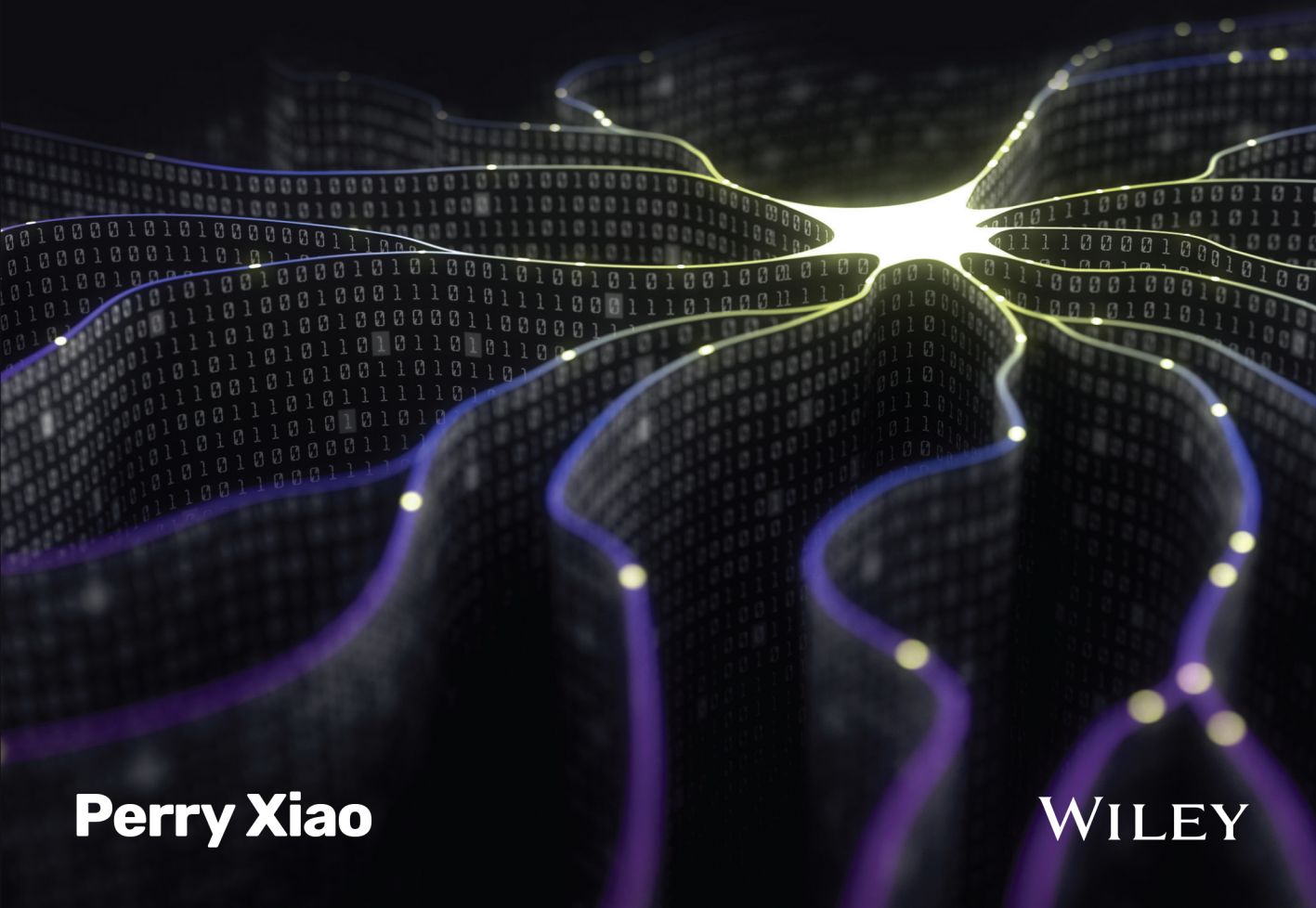
Artificial Intelligence Programming with Python®

FROM ZERO TO HERO



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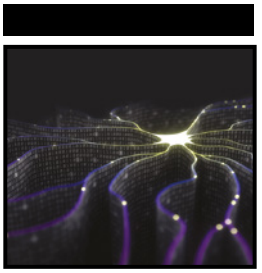

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This book is dedicated to my family. To my wife, May, my son, Zieger, and my daughter, Jessica, who make my life complete—without them, life would be meaningless. To my parents and my brother, who have shared their life and love with me that ultimately made me who I am today. To my friends and colleagues, who supported me throughout my career.

I would also like to dedicate this book to Grace Qing Wang, who sadly passed away during the course of writing this book. Grace Qing Wang was a young, energetic professional woman who was passionate about innovation and artificial intelligence in education. She was also a collaborator and a good friend. Through Grace I have made many professional connections that were very beneficial to my career.

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If you want to know more about his recent work, please visit `www.madebydata.com`.

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