PyTorch Computer Vision Cookbook

Over 70 recipes to master the art of computer vision with deep learning and PyTorch 1.x

Michael Avendi



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Production Designer: Jyoti Chauhan

First published: March 2020

Production reference: 1200320

Published by Packt Publishing Ltd. Livery Place 35 Livery Street Birmingham B3 2PB, UK.

ISBN 978-1-83864-483-3

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I would like to thank the love of my life and partner, Senem, for her patience and support. I would also like to thank little Naz, for helping her daddy type and work faster than ever.

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