

## Cambridge Elements =

Elements in Quantitative Finance edited by Riccardo Rebonato EDHEC Business School

# MACHINE LEARNING FOR ASSET MANAGERS

Marcos M. López de Prado Cornell University





## **CAMBRIDGE**UNIVERSITY PRESS

University Printing House, Cambridge CB2 8BS, United Kingdom
One Liberty Plaza, 20th Floor, New York, NY 10006, USA
477 Williamstown Road, Port Melbourne, VIC 3207, Australia
314–321, 3rd Floor, Plot 3, Splendor Forum, Jasola District Centre,
New Delhi – 110025, India

79 Anson Road, #06–04/06, Singapore 079906

Cambridge University Press is part of the University of Cambridge.

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www.cambridge.org
Information on this title: www.cambridge.org/9781108792899
DOI: 10.1017/9781108883658

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First published 2020

A catalogue record for this publication is available from the British Library.

ISBN 978-1-108-79289-9 Paperback ISSN 2631-8571 (online) ISSN 2631-8563 (print)

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### **Machine Learning for Asset Managers**

**Elements In Quantitative Finance** 

DOI: 10.1017/9781108883658 First published online: April 2020

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Abstract: Successful investment strategies are specific implementations of general theories. An investment strategy that lacks a theoretical justification is likely to be false. Hence, an asset manager should concentrate her efforts on developing a theory rather than on backtesting potential trading rules. The purpose of this Element is to introduce machine learning (ML) tools that can help asset managers discover economic and financial theories. ML is not a black box, and it does not necessarily overfit. ML tools complement rather than replace the classical statistical methods. Some of ML's strengths include: (1) a focus on out-ofsample predictability instead of in-sample variance adjudication; (2) the use of computational methods to avoid relying on (potentially unrealistic) assumptions; (3) the ability to "learn" complex specifications, including nonlinear, hierarchical, and noncontinuous interaction effects in a highdimensional space; and (4) the ability to disentangle the variable search from the specification search, in a manner that is robust to multicollinearity and other substitution effects.

**Keywords:** machine learning, unsupervised learning, supervised learning, clustering, classification, labeling, portfolio construction

**JEL classifications:** G0, G1, G2, G15, G24, E44 **AMS classifications:** 91G10, 91G60, 91G70, 62C, 60E

© True Positive Technologies, LP 2020 ISBNs: 9781108792899 (PB), 9781108883658 (OC) ISSNs: 2631-8571 (online), 2631-8563 (print)



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