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# ***Synthetic Data for Artificial Intelligence and Machine Learning: Tools, Techniques, and Applications***

**Christopher L. Howell**  
**Kimberly E. Manser**  
**Raghuveer M. Rao**  
*Editors*

**1–3 May 2023**  
**Orlando, Florida, United States**

*Sponsored and Published by*  
SPIE

**Volume 12529**

Proceedings of SPIE 0277-786X, V. 12529

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Synthetic Data for Artificial Intelligence and Machine Learning: Tools, Techniques, and Applications, edited by  
Christopher L. Howell, Kimberly E. Manser, Raghuveer M. Rao, Proc. of SPIE Vol. 12529, 1252901  
© 2023 SPIE · 0277-786X · doi: 10.1117/12.2690655

Proc. of SPIE Vol. 12529 1252901-1

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Please use the following format to cite material from these proceedings:

Author(s), "Title of Paper," in *Synthetic Data for Artificial Intelligence and Machine Learning: Tools, Techniques, and Applications*, edited by Christopher L. Howell, Kimberly E. Manser, Raghuvver M. Rao, Proc. of SPIE 12529, Seven-digit Article CID Number (DD/MM/YYYY); (DOI URL).

ISSN: 0277-786X  
ISSN: 1996-756X (electronic)

ISBN: 9781510661721  
ISBN: 9781510661738 (electronic)

Published by  
**SPIE**  
P.O. Box 10, Bellingham, Washington 98227-0010 USA  
Telephone +1 360 676 3290 (Pacific Time)  
[SPIE.org](http://SPIE.org)  
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