

COGNITIVE DATA SCIENCE IN SUSTAINABLE COMPUTING

SERIES EDITOR: ARUN KUMAR SANGAIAH

# ARTIFICIAL INTELLIGENCE IN FUTURE MINING

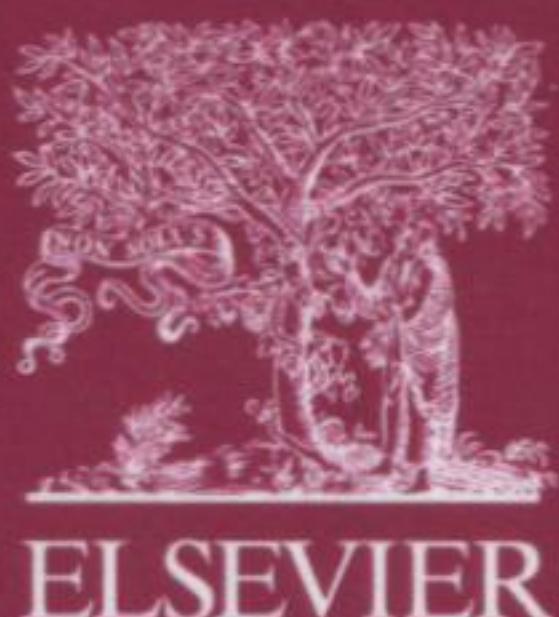
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*Artificial Intelligence in Future Mining* explores the latest developments in the use of artificial intelligence (AI) in mining and how it will impact the industry's future. The application of data science and AI in future mining involves using advanced technologies to optimize operations, improve decision-making, and enhance safety and sustainability in the industry. After a brief history of AI in mining, the editors look closely at different AI techniques used in mining. The following chapters explore ocean mining, brine mining, and urban mining. With an eye towards sustainability, the editors then review the future of wastewater mining and green mining. This book wraps up with chapters on safety and risk, resource planning, and a larger discussion of the opportunities and challenges of mining with AI in the future. This book is a must-have for researchers and professionals who find themselves at the intersection of mining, engineering, and data science.

## KEY FEATURES

- Case studies on the application of data processing, the Internet of Things, and AI in environmental sensing
- Each chapter ends with an in-depth discussion of the future implications of AI on the mining industry



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List of contributors	xiii
Preface	xvii
Introduction	xix

# 1. The evolution of artificial intelligence in mining

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<b>1.1 Introduction</b>	<b>2</b>
1.1.1 Definition of artificial intelligence and its significance in the mining industry	4
1.1.2 Brief overview of the history of mineral mining and technological advancements	5
<b>1.2 Early applications of artificial intelligence in mining</b>	<b>6</b>
1.2.1 Historical overview of early artificial intelligence and automation in mining	7
1.2.2 Early attempts at data analysis and optimization in mineral mining	8
<b>1.3 Applications of artificial intelligence in mineral mining method selection</b>	<b>10</b>
<b>1.4 Artificial intelligence application for operation automation in mineral mining</b>	<b>11</b>
1.4.1 Application of artificial intelligence in mineral prospecting and exploration	12
1.4.2 Application of artificial intelligence in mine planning	13
1.4.3 Application of artificial intelligence in machine operation in mineral mining	15
1.4.4 Application of artificial intelligence in drilling and blasting in mineral mining	16
1.4.5 Application of artificial intelligence in mineral processing	17
1.4.6 Application of artificial intelligence in environmental issues in mineral mining	18
<b>1.5 Artificial intelligence in ethical and green mineral processing</b>	<b>20</b>
<b>1.6 The climate-smart mining</b>	<b>21</b>
1.6.1 Climate mitigation in climate-smart mining: strategies and impact	24
1.6.2 Climate adaptation strategies in climate-smart mining: building resilience for sustainable resource extraction	26



1.6.3	Reducing material impacts in climate-smart mining: strategies for sustainable resource extraction	28
1.6.4	Creating marketing opportunities in climate-smart mining: sustainable resource extraction in a green economy	29
1.6.5	Renewable energy integration in climate-smart mining: a path to sustainable resource extraction	32
1.6.6	Resource efficiency in climate-smart mining: optimizing sustainable resource extraction	34
1.6.7	Reuse and recycling of low-carbon minerals in climate-smart mining: towards a circular resource economy	37
1.6.8	Leveraging carbon finance instruments in climate-smart mining: a path to sustainable resource extraction	38
1.6.9	Energy efficiency in the mineral value chain: a cornerstone of climate-smart mining	40
1.6.10	Innovation waste solutions in climate-smart mining: advancing sustainable resource extraction	43
1.6.11	Low-carbon mineral supply chain management: a key driver of climate-smart mining	45
1.6.12	Robust geological data management: a cornerstone of climate-smart mining	48
1.6.13	Gender and multistakeholder engagement: key drivers of climate-smart mining	50
1.6.14	Strong governance and regulatory framework: cornerstones of climate-smart mining	55
1.6.15	Forest-smart mining with landscape management: a cornerstone of climate-smart mining	60
1.6.16	De-risking investments for low-carbon minerals: a key driver of climate-smart mining	62
<b>References</b>		<b>67</b>

## 2. **Advances in acid mine drainage management through artificial intelligence**

*Mokhinabonu Mardonova, Muhammad Kashif Shahid, Rouzbeh Abbassi, Jun Wei Lim, Shukra Raj Paudel and Bandita Mainali*

2.1	<b>Introduction</b>	78
2.2	<b>Acid mine drainage processes</b>	79
2.2.1	Formation and characteristics	79
2.2.2	Sources	83
2.2.3	Mine impacted water classification	85
2.2.4	Environmental impact control and prevention	93
2.3	<b>Management of acid mine drainage processes</b>	95
2.3.1	Acid mine drainage management challenges	95
2.3.2	Corporate governance and frameworks	100



2.3.3	Classification frameworks for mine waste materials	102
<b>2.4</b>	<b>Circular economy and resource recirculation</b>	<b>110</b>
2.4.1	Water	111
2.4.2	Sulfuric acid, metals, and rare earth elements	113
2.4.3	Sludge and mining residues reuse	114
<b>2.5</b>	<b>Sustainability and environmental impact assessment aspects</b>	<b>114</b>
2.5.1	Sustainability and climate change in acid mine drainage	114
2.5.2	Considerations in emission analysis of acid mine drainage treatment	121
<b>2.6</b>	<b>Artificial intelligence in acid mine drainage risk prediction</b>	<b>124</b>
2.6.1	Operational approaches to acid mine drainage prediction	127
2.6.2	Artificial intelligence	144
<b>2.7</b>	<b>Conclusions</b>	<b>156</b>
	<b>References</b>	<b>157</b>

### **3. Advancing mining maintenance: integrating machine learning for proactive corrosion management**

*Jacques Lepage, Kaveh Ghouchani, Javad Mohammadpour, Fatemeh Salehi and Rouzbeh Abbassi*

3.1	Introduction	179
3.2	Pipeline corrosion in mining	181
3.3	Internal corrosion	181
3.4	External corrosion	182
3.5	Machine learning application	183
3.6	Overview of adopted machine learning techniques	184
3.7	Supervised machine learning algorithms	184
3.7.1	Neural networks and deep learning	185
3.7.2	Ensemble, tree-based, and boosting methods	185
3.7.3	Regression algorithms	185
3.7.4	Support vector methods	186
3.7.5	Time series and similarity-based methods	186
3.8	Unsupervised machine learning algorithm	187
3.9	Reinforcement machine learning algorithm	187
3.10	Machine learning techniques in corrosion modeling	187
3.11	Conclusions	190
	<b>References</b>	<b>190</b>

### **4. Revolutionizing brine mining through artificial intelligence-assisted techniques**

*Arash Khosravi, Maryam Ashkpour and Farideh Abdollahi*

4.1	Introduction	196
4.2	Types and definitions of brine resources and brine mining techniques	197
4.2.1	Categories of brine resources	197
4.2.2	Industrial processes for brine mining	201



4.3	<b>Principles and benefits of artificial intelligence-assisted brine mining</b>	203
4.3.1	General concept of artificial intelligence-techniques	204
4.3.2	Increasing efficiency and productivity using artificial intelligence-techniques	206
4.3.3	Cost reduction	208
4.3.4	Improving safety and environmental sustainability	208
4.4	<b>Artificial intelligence-assisted techniques in brine mining case studies</b>	210
4.4.1	Exploration and production	211
4.4.2	Robotics and automation	212
4.4.3	Monitoring, controlling and predictive maintenance	214
4.4.4	Characterization of brine	215
4.5	<b>Challenges and limitations of artificial intelligence-assisted brine mining techniques</b>	217
4.5.1	Data availability and quality	217
4.5.2	Technical expertise and training	218
4.6	<b>Future directions for artificial intelligence-assisted brine mining techniques</b>	218
4.6.1	Integration with other technologies	219
4.6.2	Collaboration and knowledge sharing	219
4.6.3	Regulatory frameworks and standards	219
	<b>Acknowledgments</b>	220
	<b>References</b>	220
5.	<b>Urban mining and artificial intelligence: challenges and opportunities</b>	229
	<i>Sorour Ayoubian Markazi, Shokat Akbarnezhad, Negar Karimian Ardestani and Milad Razbin</i>	
5.1	<b>Introduction</b>	229
5.2	<b>Importance of urban mining</b>	231
5.3	<b>Resources of urban mining</b>	232
5.3.1	E-waste in urban mining	232
5.3.2	Water/wastewater treatment in urban mining	233
5.3.3	Building in urban mining	235
5.4	<b>Artificial intelligence approach in urban mining</b>	236
5.5	<b>Conclusion</b>	244
	<b>References</b>	245
6.	<b>Wastewater mining: a new frontier for artificial intelligence in mining</b>	249
	<i>Hoda Khoshvaght and Mehdi Khiadani</i>	
6.1	<b>Introduction</b>	249
6.2	<b>Understanding mining wastewater</b>	252
6.2.1	Overview of mining wastewater	253
6.2.2	Mining wastewater characteristics	254



6.2.3	Environmental impact of mining activities and wastewater	255
6.2.4	Economic benefit of mining wastewater	259
6.2.5	Mining wastewater treatment techniques	264
<b>6.3</b>	<b>Role of artificial intelligence in mining wastewater</b>	<b>271</b>
6.3.1	Artificial intelligence in process controlling and optimization	272
6.3.2	Artificial intelligence in outlier detection	273
6.3.3	Artificial intelligence in water quality monitoring	281
6.3.4	Artificial intelligence in mineral extraction	284
6.3.5	Popular artificial intelligence algorithm in water and wastewater research	285
6.3.6	Artificial intelligence case studies in mining	286
<b>6.4</b>	<b>Challenges and future directions</b>	<b>289</b>
6.4.1	Challenges	289
6.4.2	Future directions	289
<b>6.5</b>	<b>Conclusions</b>	<b>294</b>
	AI disclosure	295
	Abbreviations	295
	References	297
<b>7.</b>	<b>Green mining with artificial intelligence: a path to sustainability</b>	<b>309</b>
	<i>Mahdi Pouresmaieli, Yasaman Boroumand, Meysam Habibi, Reza Maleki, Mohammad Ataei and Ali Nouri Qarahasanlou</i>	
<b>7.1</b>	<b>Introduction</b>	<b>310</b>
7.1.1	The notion of sustainable development	311
7.1.2	Necessity of sustainable mining	312
7.1.3	Mining's effects on metrics for sustainable development	312
<b>7.2</b>	<b>Sustainable development goal-based artificial intelligence and Internet of Things introduction in the mining sector</b>	<b>314</b>
7.2.1	Advanced mining automation	318
<b>7.3</b>	<b>Artificial intelligence/Internet of Things's impact on sustainable development goal in the mining sector</b>	<b>321</b>
<b>7.4</b>	<b>Effect of Internet of Things and artificial intelligence on robots and automation in the mining sector according to sustainable development</b>	<b>322</b>
7.4.1	Robotics and automation's effects on economic metrics in mining operations	323
7.4.2	Robotics and automation's effects on social metrics in mining operations	324
7.4.3	The effect of robots and automation on environmental indicators in mining operations	327
<b>7.5</b>	<b>Capabilities and limitations of artificial intelligence in sustainable development for mine designing and planning</b>	<b>329</b>
7.5.1	Feature engineering and artificial intelligence for sustainable development in mine planning and design	331



7.5.2	Data preprocessing and artificial intelligence feature engineering	334
7.5.3	Feature selection in materials	334
7.5.4	Artificial intelligence usage and its effect on sustainable development	336
7.6	The future of robotics and automation in mining	343
7.7	Discussion	344
7.8	Conclusion	345
	References	347
<b>8.</b>	<b>Enhancing safety and minimizing risk in mining processes with artificial intelligence</b>	<b>355</b>
	<i>Armaghan Javid, Mohammad Zarkesh, Yasaman Boroumand and Mohammad Al-Fawa'reh</i>	
8.1	Introduction	355
8.1.1	Challenges and risks associated with mining processes	356
8.1.2	Role of artificial intelligence in revolutionizing safety practices	357
8.2	Real-time monitoring and predictive analytics	358
8.2.1	Artificial intelligence-powered sensors for real-time data collection	358
8.2.2	Predictive analytics for identifying potential safety hazards	363
8.2.3	Vision-based data analysis	369
8.3	Autonomous vehicles and equipment for hazardous environments	372
8.3.1	Benefits of autonomous vehicles and equipment in dangerous areas	373
8.3.2	Reducing human exposure to risky tasks through automation	374
8.3.3	Different types of autonomous vehicles and equipment used in mining	375
8.3.4	AI-driven navigation and obstacle avoidance systems	376
8.4	Conclusion	377
	References	378
<b>9.</b>	<b>The future of the mining industry with artificial intelligence</b>	<b>383</b>
	<i>Walid K. Hasan, Mohammad Al-Fawa'reh, Matt Madelatparvar and Nima Fakhralmobasheri</i>	
9.1	Introduction	384
9.2	Recent advancements in artificial intelligence and autonomous solutions in mining operations	385
9.2.1	Automating extraction: robotics and artificial intelligence in underground mining	386



9.2.2	Artificial intelligence for autonomous mining trucks and uncrewed vehicles	387
9.2.3	Connected quarries: Internet of Things and data integration for mining efficiency	389
9.2.4	Waste to wealth: artificial intelligence-enabled solutions for efficient tailings management	390
<b>9.3</b>	<b>Optimizing operations</b>	390
<b>9.4</b>	<b>Hazard management</b>	390
<b>9.5</b>	<b>Potential applications of artificial intelligence in mining industry</b>	392
9.5.1	Automating extraction: robotics and artificial intelligence in underground mining	392
9.5.2	Connected quarries: Internet of Things and data integration for mining efficiency	395
9.5.3	Waste to wealth: artificial intelligence-enabled solutions for efficient tailings management	397
9.5.4	Challenges in implementing artificial intelligence in mining industry	399
9.5.5	Automating extraction: robotics and artificial intelligence in underground mining	399
9.5.6	Autonomous mining trucks and uncrewed vehicles	400
9.5.7	Connected quarries: Internet of Things and data integration for mining efficiency	401
<b>9.6</b>	<b>Conclusion and future directions</b>	402
	<b>References</b>	403