

# ISO/IEC TS 4213:2022-10 (E)

## Information technology - Artificial intelligence - Assessment of machine learning classification performance

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