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LIST OF ABBREVIATIONS

AM-LSTM	=	Attention mechanism-long short-term memory
AUC	=	Area Under the Curve
Bi-LSTM		Bidirectional long short-term memory
BMS	=	Battery management system
EVs	=	Electric vehicles
GPR	=	Gaussian process regression
GRU	=	Gated recurrent unit
ICA	=	Incremental capacity analysis
LIBs	=	Lithium-ion batteries
Li-ion	=	Lithium-ion
LSTM	=	Long short-term memory
MAE	=	Mean absolute error
MAPE	=	Mean absolute percentage error
MSE	=	Mean squared error
OCV	=	Open circuit voltage
RMSE	=	Root mean squared error
RNN	=	Recurrent neural network
RUL	=	Remaining useful life
SEI	=	Solid electrolyte interphase
SOC	=	State of charge
SOH	=	State of Health