Title: Incremental learning

URL: https://en.wikipedia.org/wiki/Incremental_learning

PageID: 52280151

Categories: Category: Machine learning algorithms

Source: Wikipedia (CC BY-SA 4.0).

Supervised learning

Unsupervised learning

Semi-supervised learning

Self-supervised learning

Reinforcement learning

Meta-learning

Online learning

Batch learning

Curriculum learning

Rule-based learning

Neuro-symbolic Al

Neuromorphic engineering

Quantum machine learning

Classification

Generative modeling

Regression

Clustering

Dimensionality reduction

Density estimation

Anomaly detection

Data cleaning

AutoML

Association rules

Semantic analysis

Structured prediction

Feature engineering

Feature learning

Learning to rank

Grammar induction

Ontology learning

Multimodal learning

Apprenticeship learning
Decision trees
Ensembles Bagging Boosting Random forest
Bagging
Boosting
Random forest
k -NN
Linear regression
Naive Bayes
Artificial neural networks
Logistic regression
Perceptron
Relevance vector machine (RVM)
Support vector machine (SVM)
BIRCH
CURE
Hierarchical
k -means
Fuzzy
Expectation-maximization (EM)
DBSCAN
OPTICS
Mean shift
Factor analysis
CCA
ICA
LDA
NMF
PCA
PGD
t-SNE
SDL
Graphical models Bayes net Conditional random field Hidden Markov
Bayes net
Conditional random field
Hidden Markov
RANSAC
k -NN

Local outlier factor
Isolation forest
Autoencoder
Deep learning
Feedforward neural network
Recurrent neural network LSTM GRU ESN reservoir computing
LSTM
GRU
ESN
reservoir computing
Boltzmann machine Restricted
Restricted
GAN
Diffusion model
SOM
Convolutional neural network U-Net LeNet AlexNet DeepDream
U-Net
LeNet
AlexNet
DeepDream
Neural field Neural radiance field Physics-informed neural networks
Neural radiance field
Physics-informed neural networks
Transformer Vision
Vision
Mamba
Spiking neural network
Memtransistor
Electrochemical RAM (ECRAM)
Q-learning
Policy gradient
SARSA
Temporal difference (TD)
Multi-agent Self-play
Self-play
Active learning
Crowdsourcing
Human-in-the-loop

Mechanistic interpretability
RLHF
Coefficient of determination
Confusion matrix
Learning curve
ROC curve
Kernel machines
Bias-variance tradeoff
Computational learning theory
Empirical risk minimization
Occam learning
PAC learning
Statistical learning
VC theory
Topological deep learning
AAAI
ECML PKDD
NeurlPS
ICML
ICLR
IJCAI
ML
JMLR
Glossary of artificial intelligence
List of datasets for machine-learning research List of datasets in computer vision and image processing
List of datasets in computer vision and image processing
Outline of machine learning
v
t
е
Artificial general intelligence
Intelligent agent
Recursive self-improvement
Planning
Computer vision
General game playing
Knowledge representation

Natural language processing
Robotics
AI safety
Machine learning
Symbolic
Deep learning
Bayesian networks
Evolutionary algorithms
Hybrid intelligent systems
Systems integration
Open-source
Bioinformatics
Deepfake
Earth sciences
Finance
Generative AI Art Audio Music
Art
Audio
Music
Government
Healthcare Mental health
Mental health
Industry
Software development
Translation
Military
Physics
Projects
AI alignment
Artificial consciousness
The bitter lesson
Chinese room
Friendly Al
Ethics
Existential risk
Turing test
Uncanny valley

Progress
Al winter
Al boom
Al bubble
Glossary

٧

t

е

In computer science, incremental learning is a method of machine learning in which input data is continuously used to extend the existing model's knowledge i.e. to further train the model. It represents a dynamic technique of supervised learning and unsupervised learning that can be applied when training data becomes available gradually over time or its size is out of system memory limits. Algorithms that can facilitate incremental learning are known as incremental machine learning algorithms.

Many traditional machine learning algorithms inherently support incremental learning.

Other algorithms can be adapted to facilitate incremental learning.

Examples of incremental algorithms include decision trees (IDE4, [1] ID5R [2] and gaenari), decision rules , [3] artificial neural networks (RBF networks , [4] Learn++, [5] Fuzzy ARTMAP, [6] TopoART, [7] and

IGNG [8]) or

the incremental SVM . [9]

The aim of incremental learning is for the learning model to adapt to new data without forgetting its existing knowledge. Some incremental learners have built-in some parameter or assumption that controls the relevancy of old data, while others, called stable incremental machine learning algorithms, learn representations of the training data that are not even partially forgotten over time. Fuzzy ART [10] and TopoART [7] are two examples for this second approach.

Incremental algorithms are frequently applied to data streams or big data, addressing issues in data availability and resource scarcity respectively. Stock trend prediction and user profiling are some examples of data streams where new data becomes continuously available. Applying incremental learning to big data aims to produce faster classification or forecasting times.

See also

Transduction (machine learning)

References

External links

charlesIparker (March 12, 2013). "Brief Introduction to Streaming data and Incremental Algorithms" . BigML Blog .

Gepperth, Alexander; Hammer, Barbara (2016). Incremental learning algorithms and applications (PDF) . ESANN . pp. 357–368.

LibTopoART: A software library for incremental learning tasks

"Creme: Library for incremental learning". Archived from the original on 2019-08-03.

gaenari: C++ incremental decision tree algorithm

YouTube search results Incremental Learning