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ANALYTICAL SOFTWARE AND FRAMEWORKS

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MACHINE LEARNING AND ARTIFICIAL INTELLIGENCE FRAMEWORKS



- Understand concepts of machine learning and artificial intelligence
- Know modern frameworks for machine learning
- Get an overview of how to utilize machine learning algorithms in R and Python
- Get an overview of cloud-based machine learning providers and their portfolios



- 1. What is Machine Learning?
- 2. How does supervised machine learning differ from unsupervised learning?
- 3. How do features of available cloud-based machine learning frameworks differ?

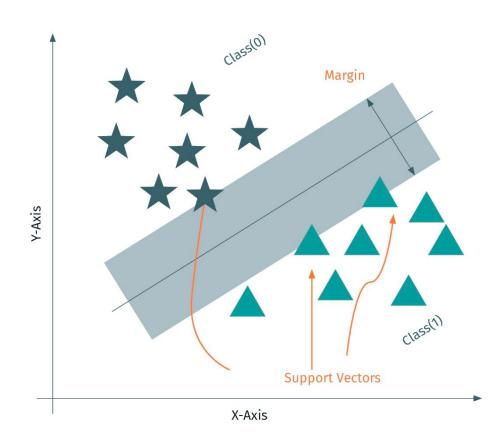
Machine learning is ...

- "[...] about machines making sense out of data in much the same way that humans do. [...] a type of artificial intelligence whereby an algorithm or method extracts patterns from data."¹
- "[...] a field of study that gives computers the ability to learn without being explicitly programmed. [...] the process by which a computer can work more accurately as it collects and learns from the data it is given."²

Three **main types** of machine learning

- Supervised learning
 - Classification
 - Regression
- Unsupervised learning
 - Clustering
- Reinforcement learning

SVM Description for Linearly-Separable Data



MODERN MACHINE LEARNING FRAMEWORKS AND PACKAGES/LIBRARIES

Framework	Description	
Apache Spark ML	A scalable stand-alone machine-learning library that can access multiple sources of data. It includes many high-quality algorithms such as Naïve Bayes, linear and logistic regression, and K-means. It is utilized in Java and interoperated with Python and R libraries.	
PyTorch	PyTorch An open-source framework with maximum flexibility and speed to build machine-learn algorithms for a wide range of applications. It provides a powerful multidimensional arr support many routines such as indexing and transposing. This framework is also embeddathrough ports to iOS and Android backends.	
Scikit-Learn	Built on NumPy, SciPy, and matplotlib. Mainly used when the data-analysis tasks require stand-alone computing on individual computers. Can be integrated via APIs to other language to model workflows.	
Tensorflow	An open-source End-to-End ML platform designed by Google to develop and deploy machine-learning models for different platforms. It has flexible tools and resources using data flow graphs to train models . Runs on CPU , GPU , TPU , hence can be integrated on all platforms , e.g., like mobile, IoT, web browser, cloud.	
Keras	An API on top of TensorFlow 2 designed "for human beings, not machines". It follows best practices for reducing cognitive load by offering consistent & simple APIs , minimizing the number of actions required for common use cases, and providing clear error messages .	

MODERN MACHINE LEARNING FRAMEWORKS AND PACKAGES/LIBRARIES

Framework	Description		
Apple's Core ML	A framework that is designed to integrate machine-learning techniques into an IOS app. It can be personalized for domain-specific functionality and is optimized for ondevice performance. It supports techniques such as image analysis, natural language processing, and decision trees.		
Microsoft Azure ML	An interactive (drag and drop) framework and platform to build predictive analysi model on connected experimental datasets with a visual workspace. The develope models may be published as web services for custom apps.		
Google ML, Vertex Al	A cloud-based unified AI platform to build, deploy, and scale ML models faster with pre-trained and custom tooling.		
A cloud-based machine-learning framework and platform designed by Amazon. Amazon ML, SageMaker provides a visualization wizard and is mainly utilized for classification and regretasks.			

KERAS VS. TENSORFLOW VS. PYTORCH

	TensorFlow	Keras	PyTorch
API/Scope	End-to-end platform for machine learning, originating from Google. Includes Keras as tf.keras for a user-friendly start. Covers full range for ML projects an every step of the ML workflow, from data management to distributed model training on clusters and deployment to many platforms (IoT devices, web browsers, mobile iOS and Android, web APIs in the cloud). Runs on CPU, GPU, or TPU.	High-level APIs focused on simplicity of use, enabling rapid development and prototyping for common use cases. Default backend is now TensorFlow 2 with all its capabilities.	Direct competitor of TensorFlow with similar capabilities and its own ecosystem. Originating from FAIR (Facebook AI Research). Covers ML projects from research prototyping to production deployment. Lower-level APIs. High-level library with scikit-learn compatibility via skorch from the PyTorch ecosystem. Runs on CPU, GPU, or TPU.
Licensing	Open source	Open source	Open source

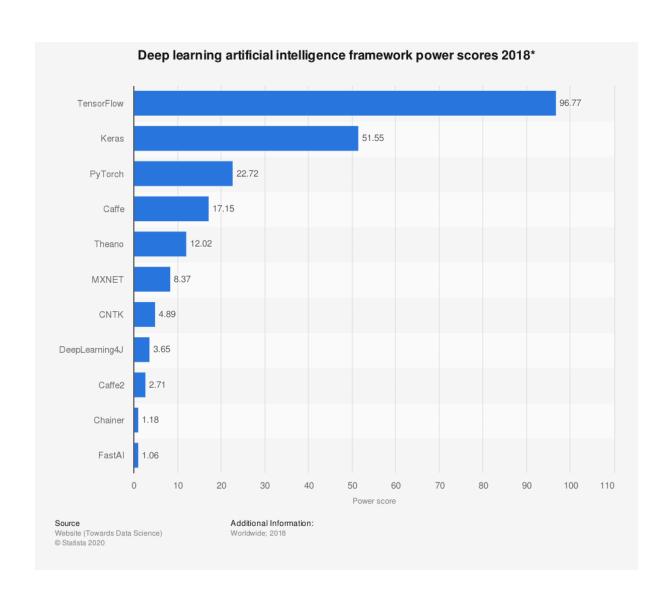
CLOUD-BASED MACHINE LEARNING/MACHINE LEARNING AS A SERVICE (MLaaS)

	Amazon ML, Amazon SageMaker	Microsoft Azure ML	Google ML, Vertex AI
Common Features (in different shapes)	Pre-trained models, services, APIs, e.g., computer vision, language, conversation; Development of own ML models; Integration into other cloud services of that vendor; AutoML (training models without code and minimal expertise); MLOps (manage data and models at scale), One-click-deployments; Support for responsible/fair ML models; Distributed training; Model versioning; Experiment tracking; Hosted collaborative and/or local notebooks		
Differences	SageMaker Studio IDE and Rstudio on SageMaker with built-in debugger and profiler, SageMaker Edge Manager for optimizing, securing, monitoring, maintaining edge devices	ML Studio, a GUI-based cloud IDE for "drag-and-drop machine learning", Native ML pipelines (Azure ML pipeline), PyTorch Enterprise support	Jupyter notebook based Vertex AI workbench with managed or user- managed notebooks (Deep Learning VM instances), Vertex AI pipelines

- Many packages for machine learning are available in the R ecosytem provided by the "Comprehensive R Archive Network" (CRAN), e.g., the popular tidymodels.
- TensorFlow and Keras may be used through wrapper
 packages (tensorflow, keras, kerasR) that allow their usage from R code.
- PyTorch is available through the torch package without dependencies to Python.

MACHINE LEARNING IN PYTHON

- Direct access to most
 popular machine-learning
 frameworks, APIs, libraries,
 and platforms, e.g., scikit-learn, TensorFlow, Keras,
 PyTorch
- One main driver of Python's popularity



REVIEW STUDY GOALS

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SESSION 4

TRANSFER TASK

TRANSFER TASK

Open the provided RStudio/Jupyter notebooks and work through the examples to build and train a machine-learning model.

Please let me know if you got stuck so we can work through it together.

Gather in three groups and work through the following task! Visit

- 1. Azure ML (https://azure.microsoft.com/en-us/services/machine-learning/)
- 2. Amazon SageMaker (https://aws.amazon.com/pm/sagemaker/)
- 3. Google Vertex AI (https://cloud.google.com/vertex-ai)
 and research to explain what the respective vendor understands by **AutoML** and how features and tools support AutoML in its portfolio.

TRANSFER TASK PRESENTATION OF THE RESULTS

Please present your results.

The results will be discussed in plenary.





1. Which of the following frameworks offers machine learning in the cloud with built-in algorithms?

- a) Amazon ML/SageMaker
- b) Microsoft Azure ML
- c) Google ML/Vertex AI
- d) Apache Mahout ML



2. Scikit-learn (sklearn) is the official machine learning package in Python and is built on ...

- a) the MatplotLib package.
- b) the Scipy package.
- c) the Numpy package.
- d) all of the above.



3. **model.compile** is a Keras method, which can be called on a model instance to ...

- a) configure the model for training, e.g., define optimizer, loss function, and metrics to be evaluated.
- b) train the developed prediction model on the training set.
- c) evaluate the performance of the developed prediction model.
- d) set the architecture of the developed prediction model.

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