

Introduction

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Mineure - Science des données pour l'ingénieur

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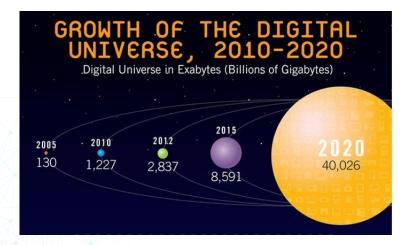


"Before I write my name on the board, I'll need to know how you're planning to use that data."

www.enac.t

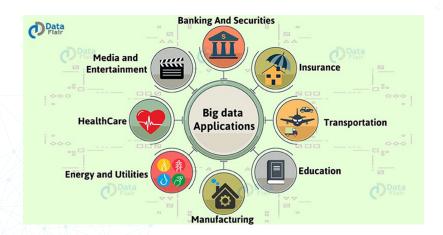


Data sources and quantities





Big data applications





What is machine Learning?

- Machine learning can be defined as computational methods using experience to improve performance or to make accurate predictions. (cf. M. Mohri, A. Rostamizadeh and A. Talwalkar: Foundations of Machine Learning)
- Experience refers to the past information available to the learner, which typically takes the form of electronic data collected and made available for analysis.
- It is also assumed that there is a link within the data and that our algorithms will help us find it. This is a strong assumption: by default, there is usually no link in the data.
- Tom Mitchell (1998): A computer program is said to learn from experience E with respect to some task T and some performance measure P, if its performance on T, as measured by P, improves with experience E.



What is the difference between machine learning and statistics?

 According to Wasserman, a professor in both the Department of Statistics and in the Machine Learning Department at Carnegie Mellon

"The short answer is: None. They are ... concerned with the same question: how do we learn from data?"

- But Wasserman notes that if you look at some of the details, there is a "more nuanced" answer that reveals minor differences:
 - Statistics emphasizes formal statistical inference (confidence intervals, hypothesis tests, optimal estimators) in low dimensional problems.
 - Machine Learning emphasizes high dimensional prediction problems.



What is the difference between machine learning and statistics?

- Furthermore, ML is more focused on making accurate predictions; making good predictions trumps more formal considerations like testing assumptions, etc.
- Go a step further, we can also state that ML isn't just more focused on making predictions, but is more focused on building software systems that make predictions.
- So, some people argue that ML is more of an "engineering discipline" whereas statistics is more of a "mathematical" discipline.
- ML and statistics tend to favour different tools (Python, R)
- ML typically work on "bigger" data than statistics



What is the difference between machine learning and statistics?

Professor Rob Tibshirani created a glossary comparing several major terms in machine learning vs statistics.

| Machine Learning | Statistics |
|-------------------------------|--------------------------------|
| network,graphs | model |
| weights | parameters |
| learning | fitting |
| generalization test | test set performance |
| supervised learning | regression/classification |
| unsupervised learning | density estimation, clustering |
| large grant $\$1,000,000$ | large grant $\$50,000$ |
| nice place to have a meeting: | nice place to have a meeting: |
| Snowbird, Utah, French Alps | Las Vegas in August |



Objectives of the DATA's minor

The general objective of this minor is not to train "data scientists" but to complete the IENAC training in order to:

- provide IENAC with data science skills that enable them to work with "data scientists" while providing their air transport skills;
- prepare for the evolution of the engineering profession due to the increasing use of big data;
- enable work in innovation on the use of big data in the aviation field.



THE DATA SCIENCE
HIERARCHY OF NEEDS

LEARN/OPTIMIZE

AGGREGATE/LABEL

EXPLORE/TRANSFORM

MOVE/STORE

COLLECT

DEEP LEARNING, A/B TESTING, EXPERIMENTATION, SIMPLE ML ALGORITHMS

ANALYTICS, METRICS, SEGMENTS, AGGREGATES, FEATURES, TRAINING DATA

CLEANING, ANOMALY DETECTION, PREP

RELIABLE DATA FLOW, INFRASTRUCTURE, PIPELINES, ETL, STRUCTURED AND UNSTRUCTURED DATA STORAGE

INSTRUMENTATION, LOGGING, SENSORS, EXTERNAL DATA, USER GENERATED CONTENT





Teachers: Richard Alligier, Nicolas Couellan, Ludovic d'Estampes, David Gianazza, Laurent Lapasset, Paul Rochet







Courses: Big Data (Laurent)







 Courses: Cloud (Laurent), Hadoop-Spark (Laurent), Kubernetes (Laurent), OpenStack (Laurent)





- Courses: Data preparation and exploration (Ludovic),
 Multidimensional analysis (Ludovic)
- Labs: Data munging/wrangling, Data visualisation, PCA and HAC





- Courses: Principles and methodology of Machine Learning (David)
- Labs: Risk and bias variance





- Courses: Linear regression models (Paul), CART-random forest (Richard), Gradient boosting (Richard), Support vector machine (Nicolas), Optimisation for machine learning (Nicolas),
 Virtualisation (Laurent), Docker (Laurent), Neural networks (David), Deep learning (Nicolas), NLP (Laurent)
- Labs: Linear regression models, CART-random forest, Gradient boosting, Support vector machine, Virtualisation, Docker, Neural networks, Deep learning, NLP



Conferences and Evaluation

Conferences

4 business driven conferences

Evaluation

- Reverse pedagogy: presentation of methods not studied or extension of methods studied (two sessions): coeff. 3.3
- Exam across all methods: coeff. 3.3
- Typical project "challenge" on wind turbines: coeff. 3.4
- Mandatory attendance at conferences