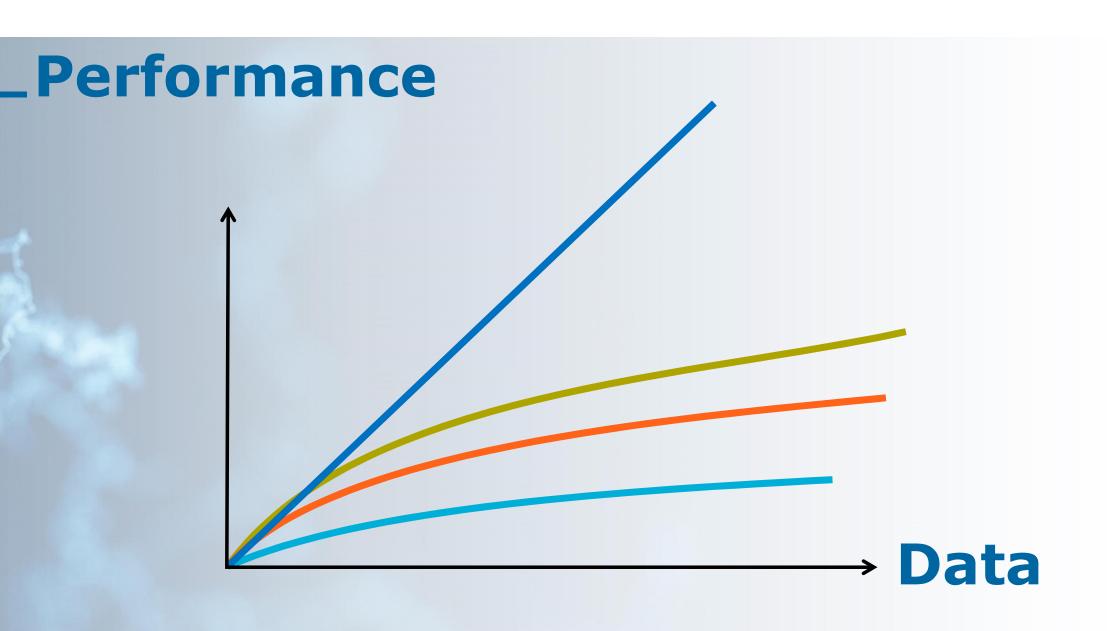
# **Hybrid AI, In Projects**

## **Thierry Caminel**

AI Technology and Innovation Leader,
Distinguished Expert,
Member of the Atos Scientific Community



# The New York Times June 6, 2018

# Computers with common sense

Some experts are hoping to find a smarter path to artificial intelligence

### BY STEVE LOHR

For the past five years, the hottest thing in artificial intelligence has been a branch known as deep learning. The grandly named statistical technique, put simply, gives computers a way to learn by processing large amounts of data. Thanks to deep learning, computers can easily identify faces and recognize spoken words, making other forms of humanlike intelligence suddenly seem within reach.

Companies like Google, Facebook and Microsoft have poured money into deep learning. Start-ups pursuing everything from cancer cures to back-office automation trumpet their deep learning expertise. And the technology's percep-



The Kyndi office. The company's software can identify concepts and not just words.

swer, even when that phrase does not appear in a document.

And Kyndi's reading and scoring software is fast. A human analyst, Mr. Welsh said, might take two hours on average to read a lengthy scientific document, and perhaps read 1,000 in a year. Kyndi's technology can read those 1,000 documents in seven hours, he said.

Kyndi serves as a tireless digital assistant, identifying the documents and passages that require human judgment. "The goal is increasing the productivity of the human analysts," Mr. Welsh said.

Kyndi and others are betting that the time is finally right to take on some of the more daunting challenges in A.I. That echoes the trajectory of deep learning, which made little progress for decades before the recent explosion of digital data and ever-faster computers fueled leaps in performance of its so-called neural networks, digital layers loosely analogous to biological neurons. The "deep" refers to many layers.

# **Cognitive Stages**

YOUNG CHILD

**Symbols or words** represent objects



**Exploration,** direct sensory input

**Connectionist AI** 

Deep-learning...



ADOLESCENT, ADULT

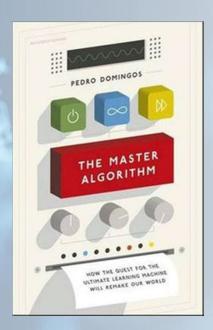
Abstraction and reasoning



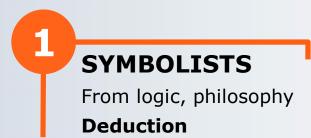
**Symbols** 

Symbolic AI Rule engines...

### 5 tribes of AI



The Master Algorithm, Pedro Domingo



CONNECTIONISTS

From neuroscience **Backpropagation** 

EVOLUTIONARIES
From evolutionary biology
Genetic programming

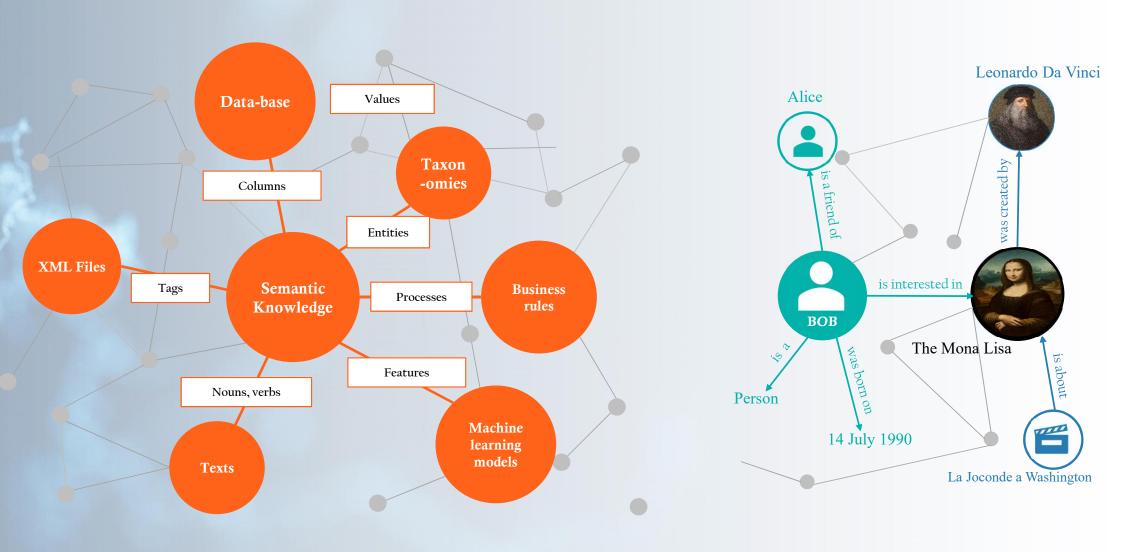
BAYESIANS
From Statistics
Probabilistic inference

ANALOGIZERS
From psychology
Kernel machines

# **Examples Hybrid AI**

Hybridation	Use case
Semantic Graphs embedded in Neural Networks	Better fraud detection Job search
Production Rules created by ML	Understandable decision (credit scoring, troubleshooting,)
Learning parameters in expert created Bayesian network	Diagnostic, troubleshooting
Neural Networks to create a Semantic Graphs	Better graphs of users, resources,
Semantic graph to provide more features in ML models	Better analysis (ex access control)
Bayesian reasoning in Neural Networks	More robust decision making
Neural Networks in Multi Agent Systems	Autonomous defense systems

# Link together different data silos > Create Knowledge Graphs > Integrated knowledge



# **Bring AI Magic to the Enterprise**





"How to configure the new production line to meet new customer requirements?"

"I will evaluate all constraints and provide a list of possibilities."

# Take-aways

Create a global data reference model to break down internal silos

Add formal semantic representations to existing data to allow inference and machine processing

Start **building knowledge graphs** for each business domain to **ease integration** of multiple data source, machine learning models and business rules.

# Question?