



# Deep learning for aerospace applications

Alexandre Boulch

# Deep Learning

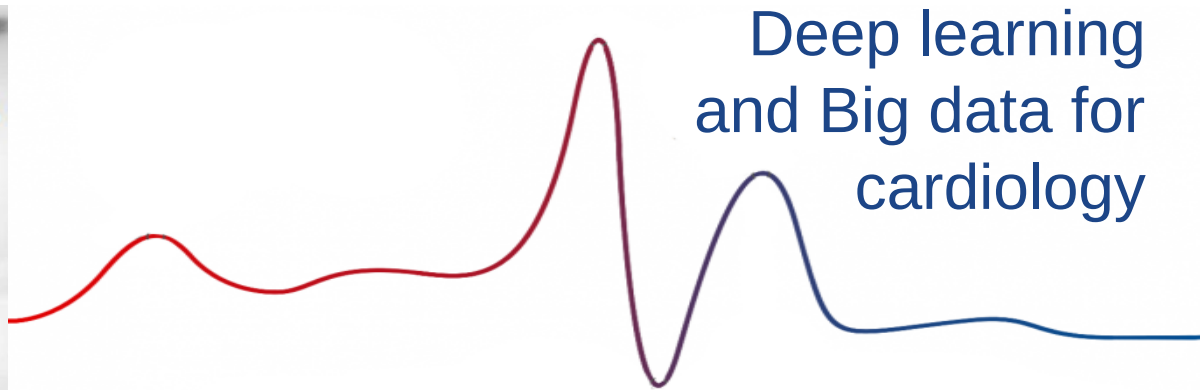
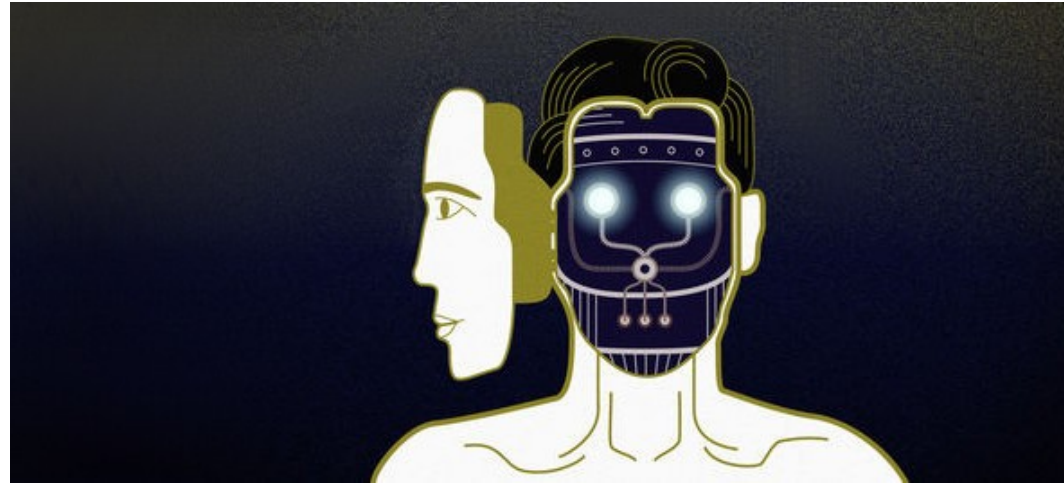


Lee Sedol 2015/10  
Ke Jie 2017/05

# Deep Learning

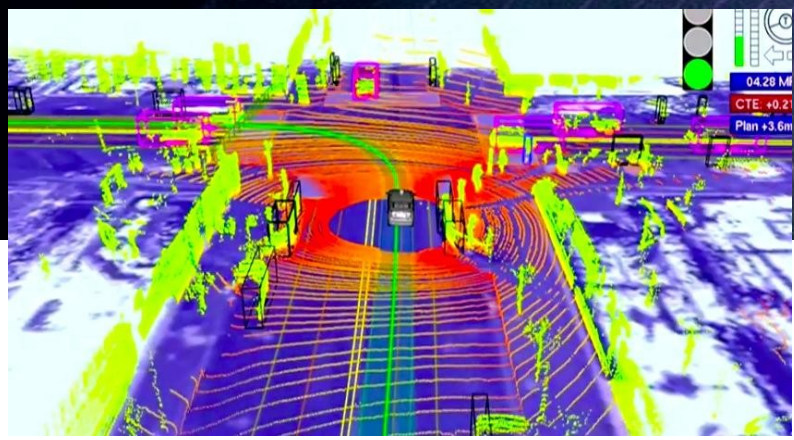
## Personal assistant

Personalised learning  
Recommendations  
Réponse automatique



2017

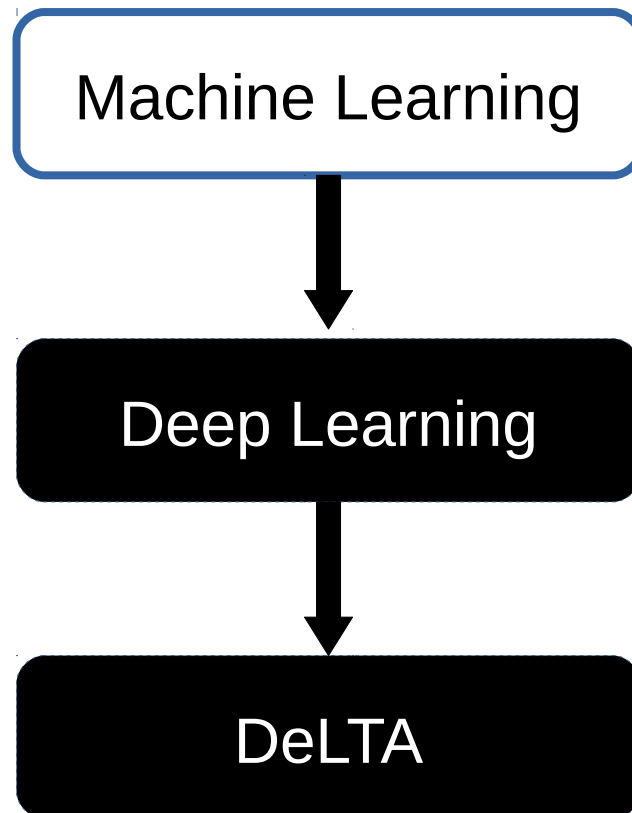
# Deep Learning



2017



# Overview



# AI

The science and engineering of making intelligent machines.

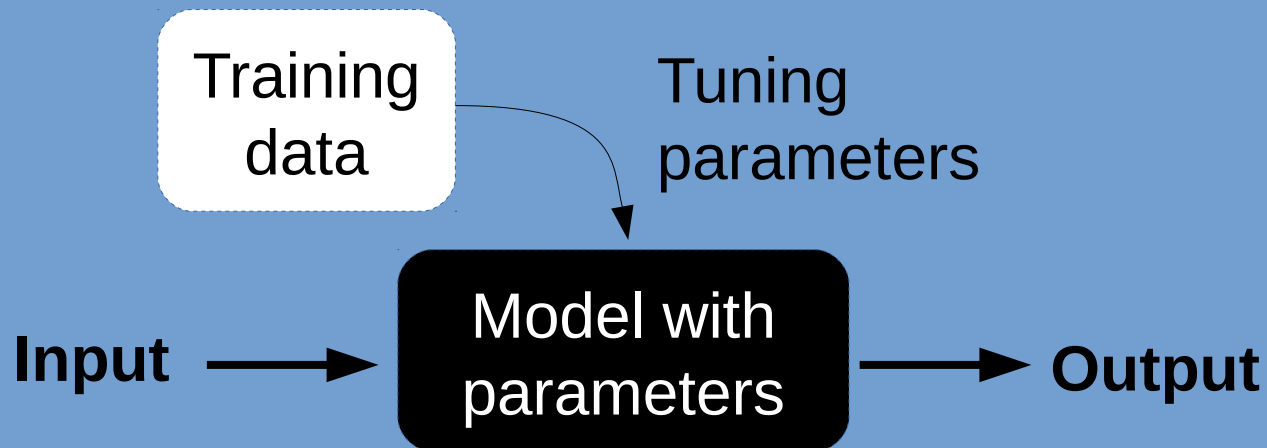
Logical, search, pattern recognition, planning, inference, learning from experience...

# AI

## Intelligent machines

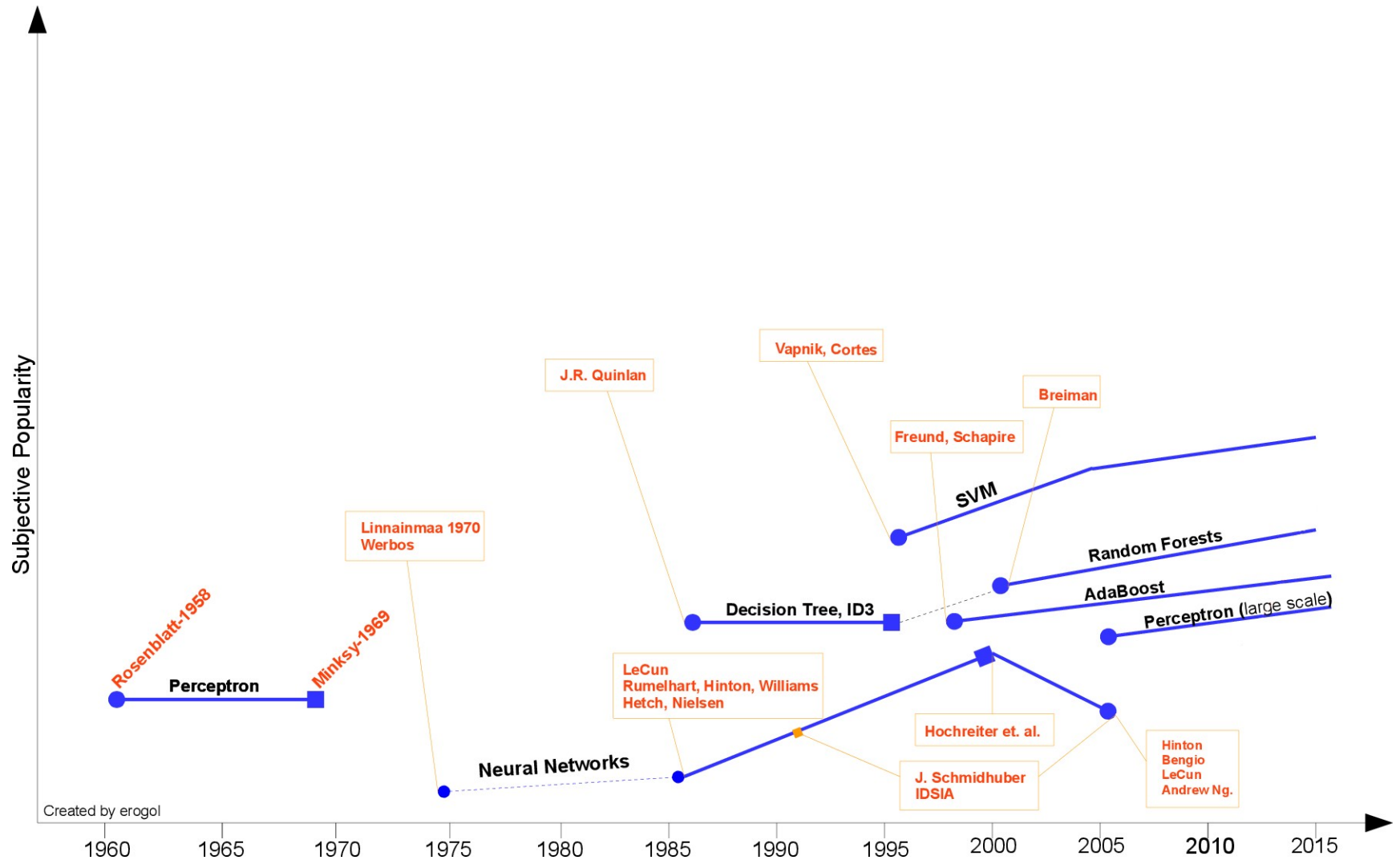
### Machine Learning

Learning from experience





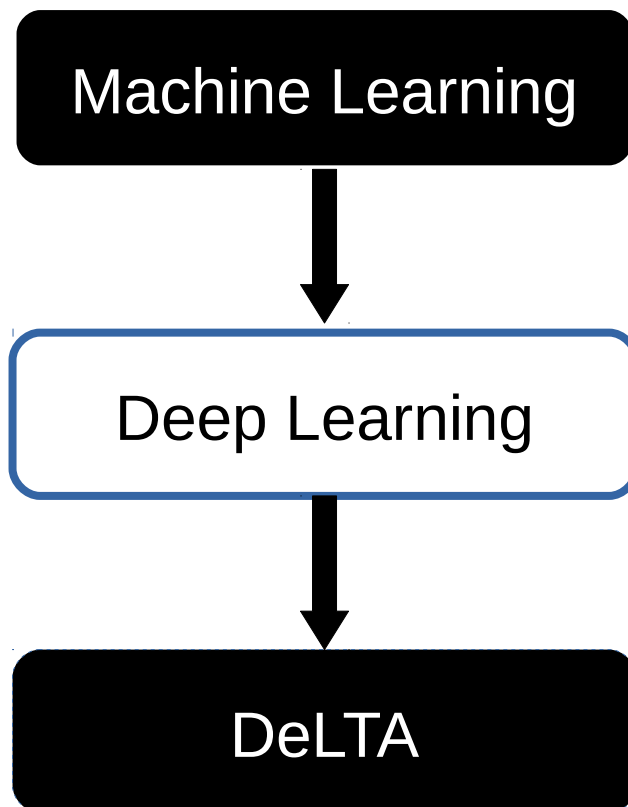
# Machine learning starts in the 60's



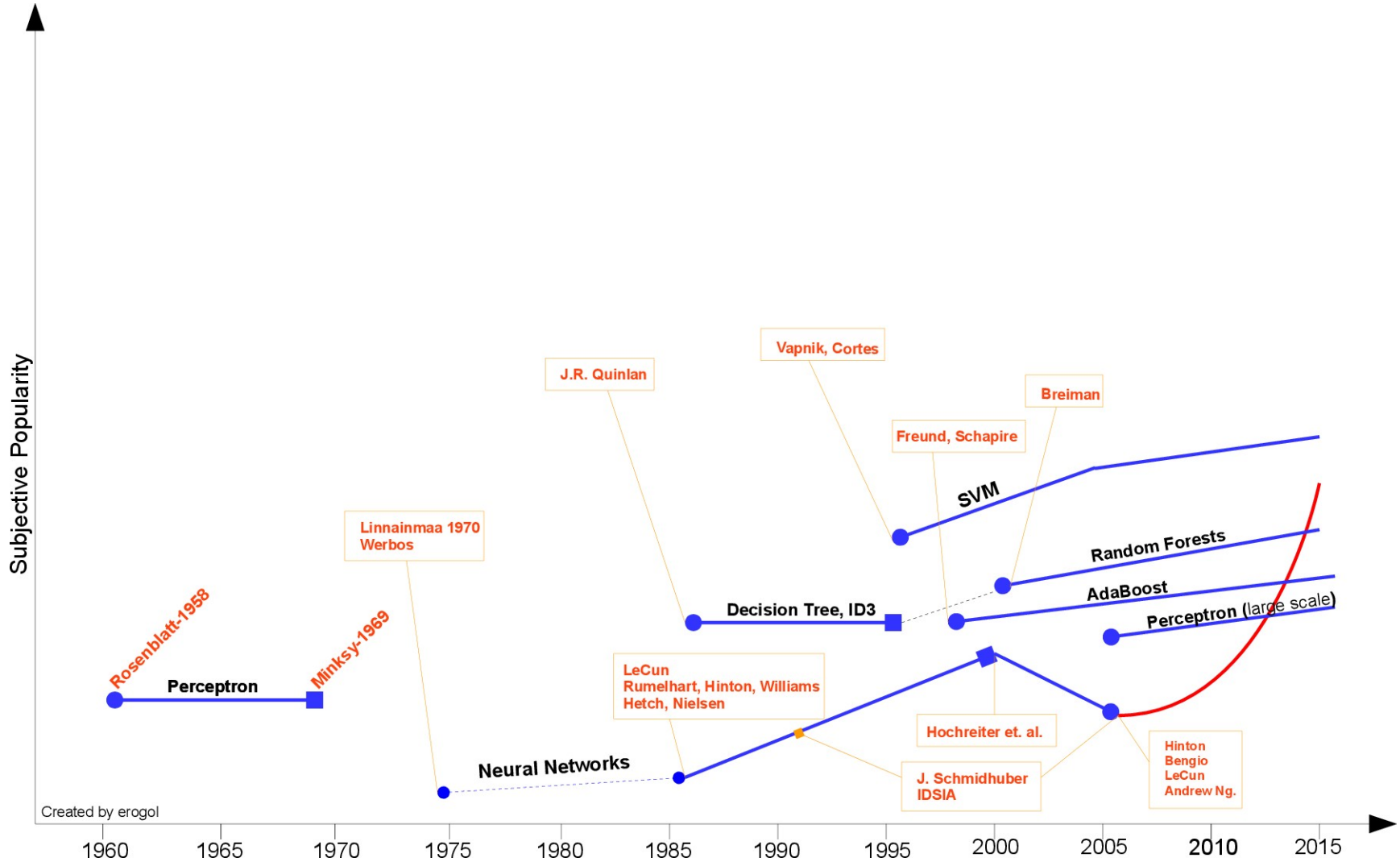
Created by erogol



# Overview

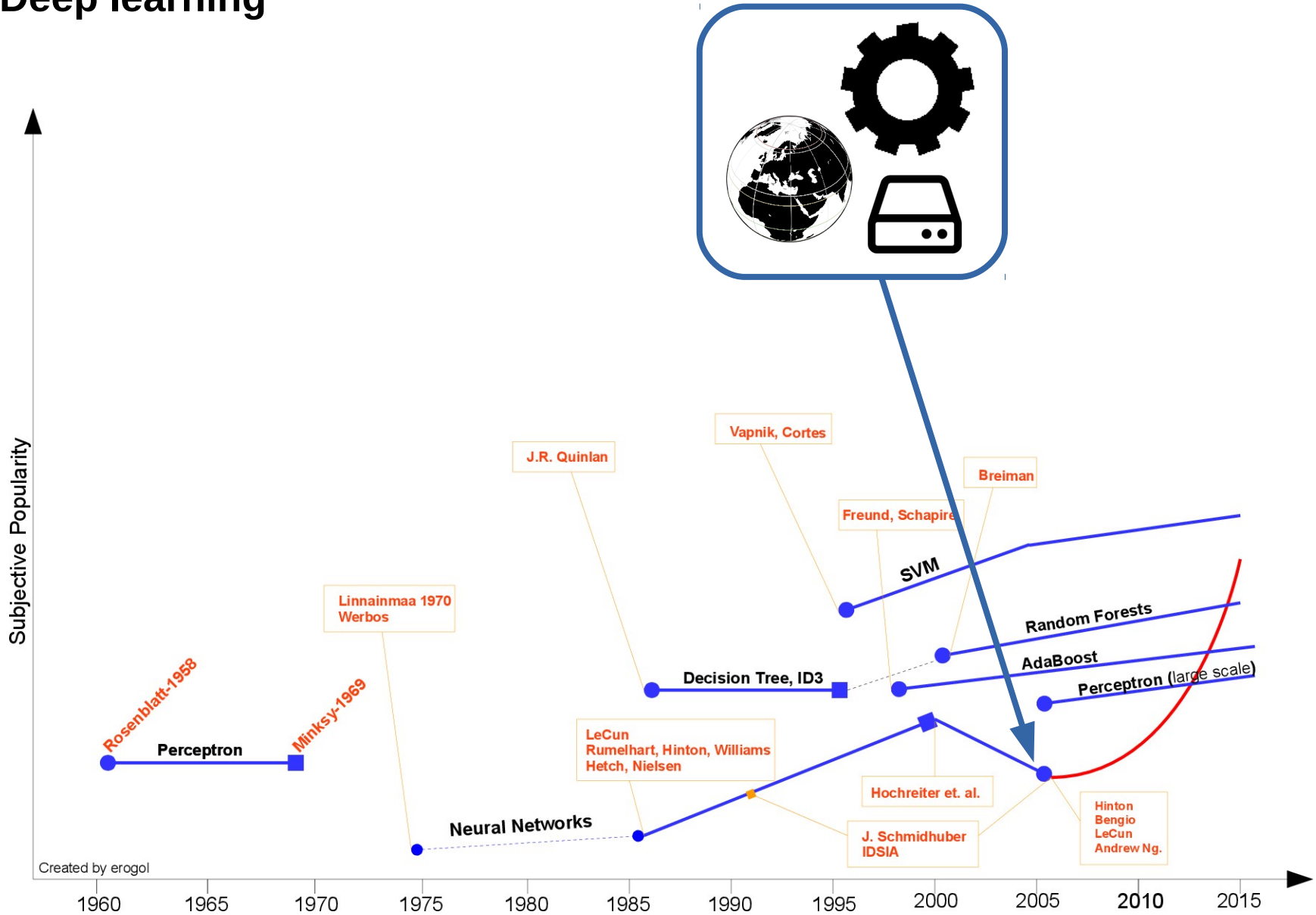


# Deep learning



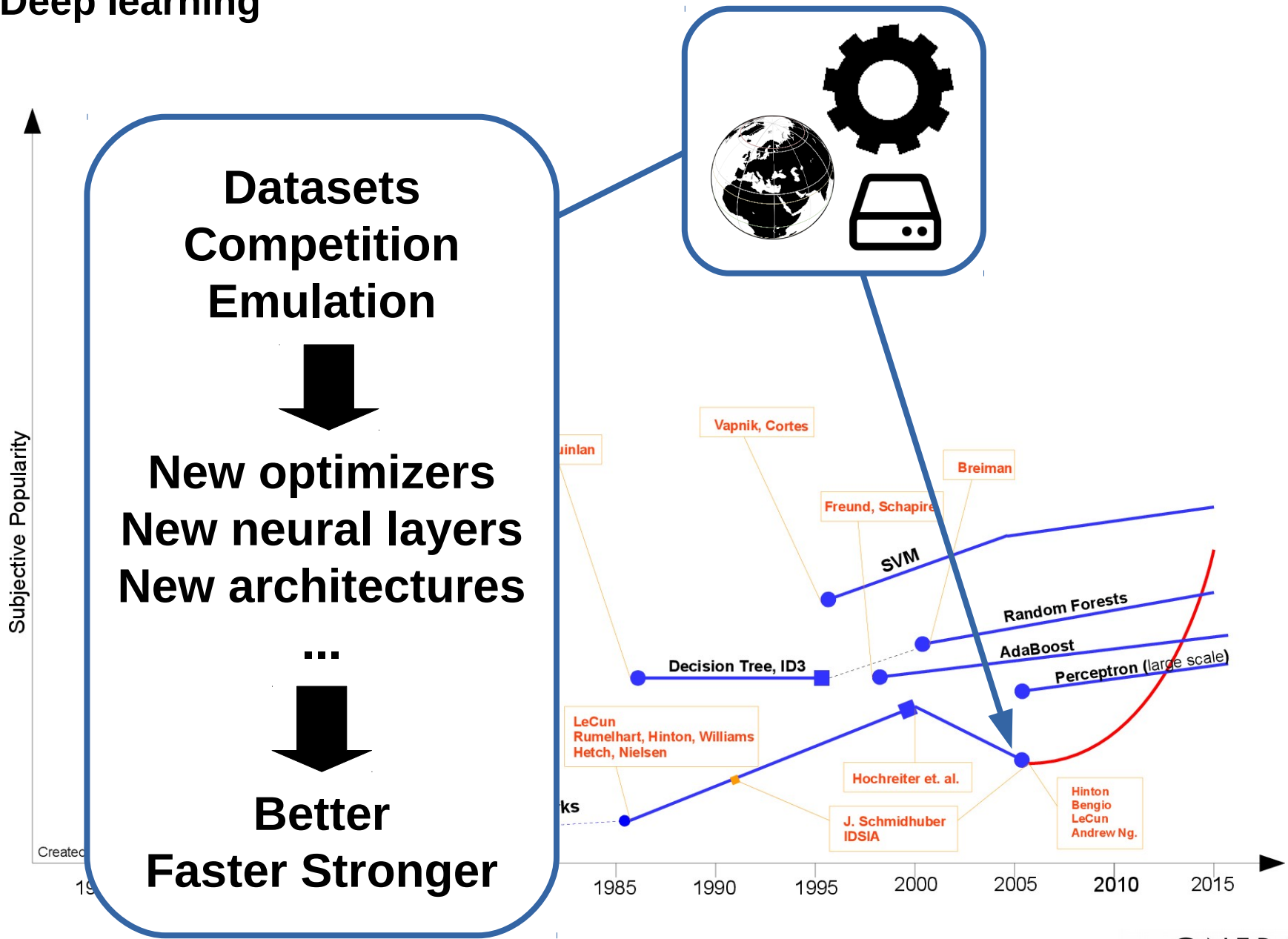
Created by erogol

# Deep learning

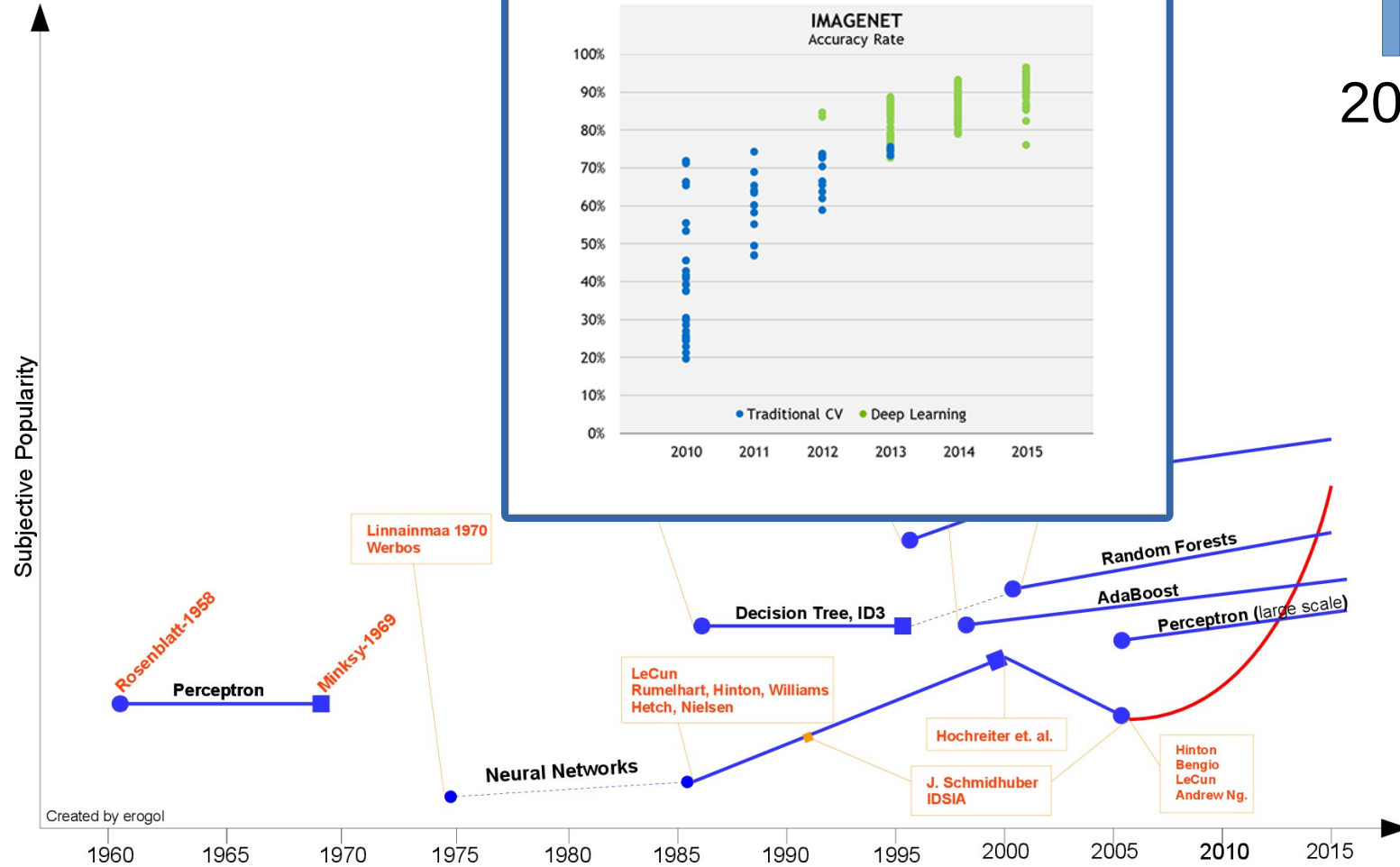


Created by erogol

# Deep learning



# Deep learning



↑  
2017

# Deep learning

## AI

Intelligent machines

### Machine Learning

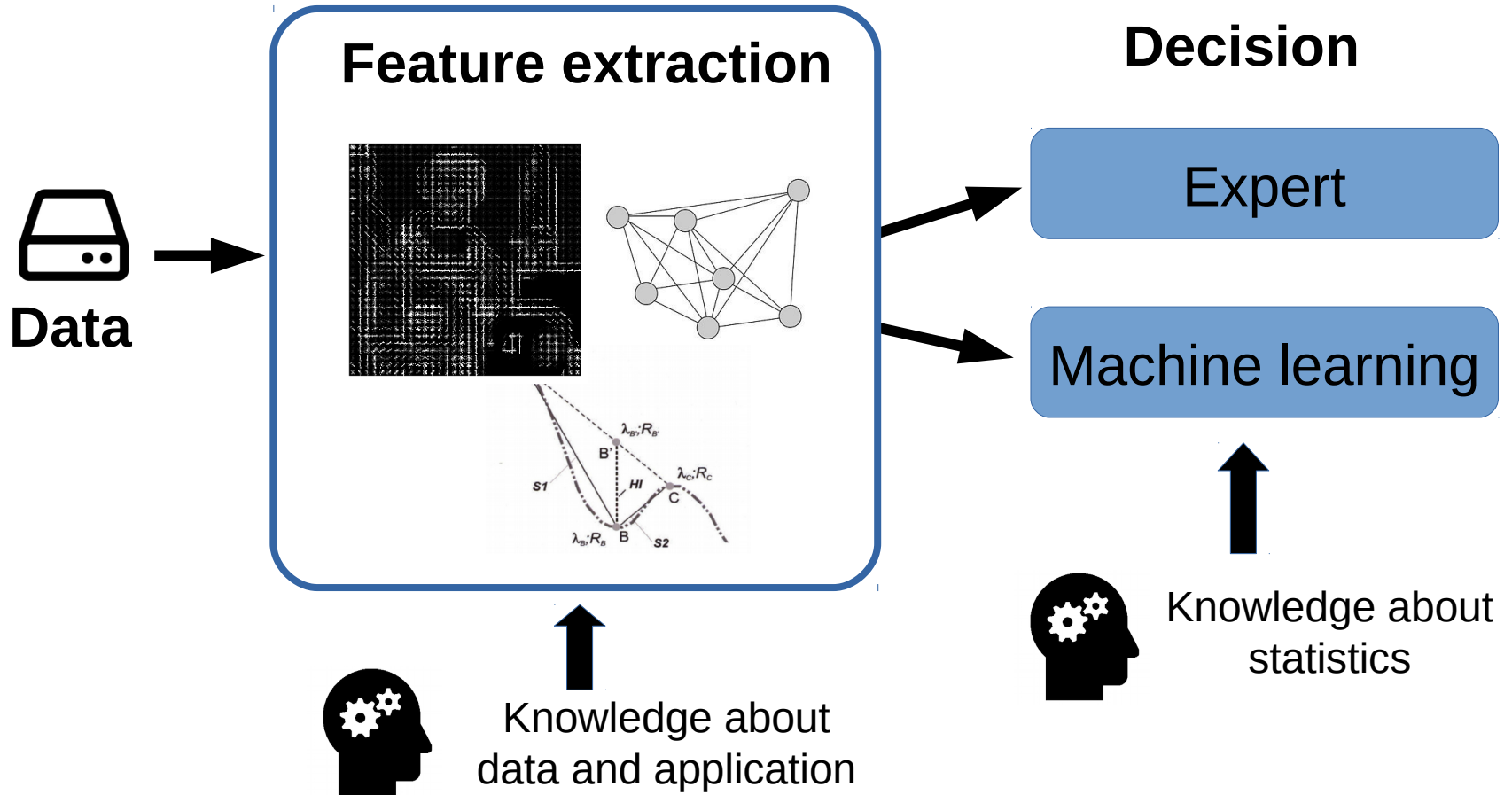
Learning from experience

### Deep learning

Auto-learning

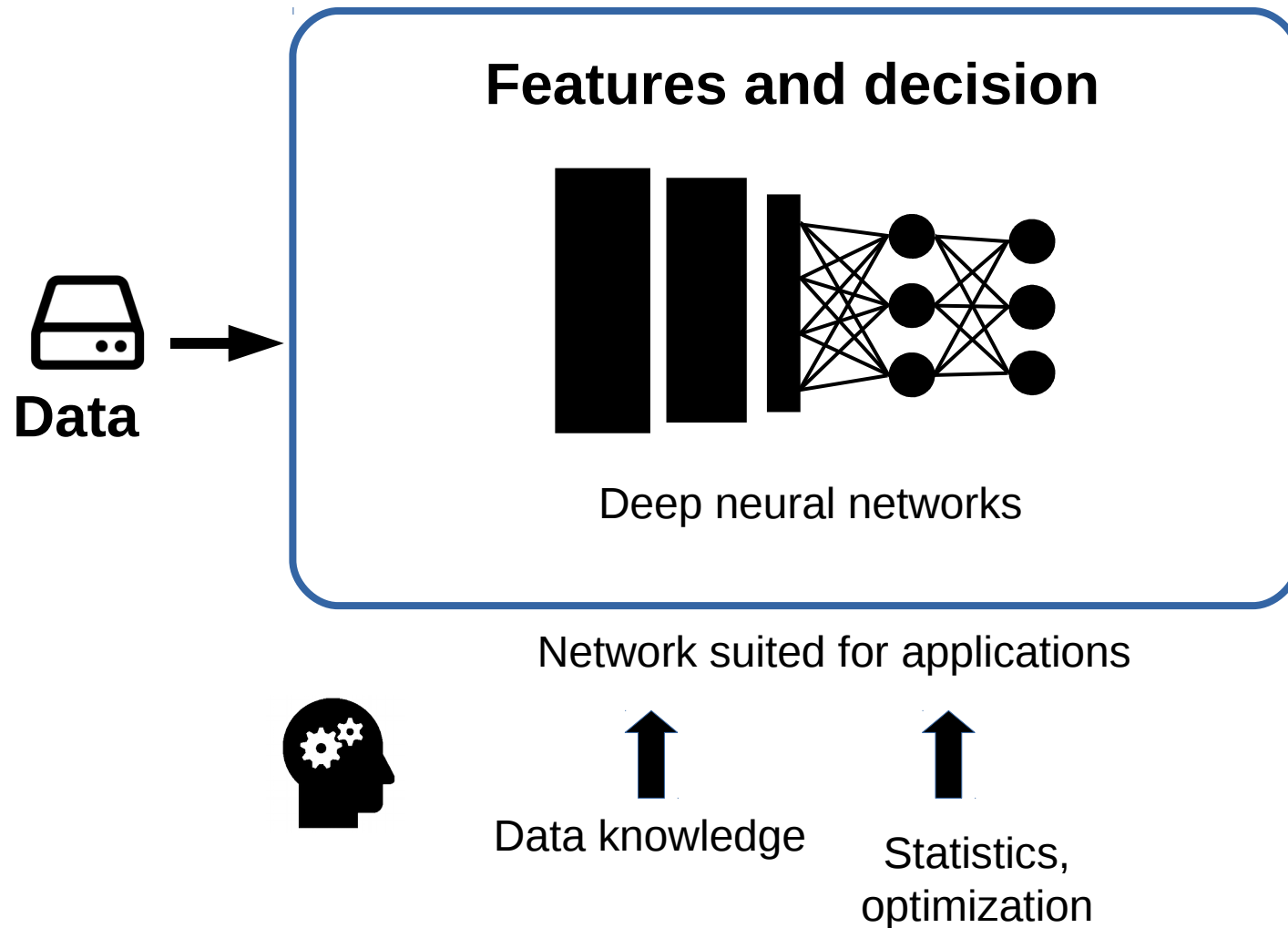
Deep neural networks

# Deep learning

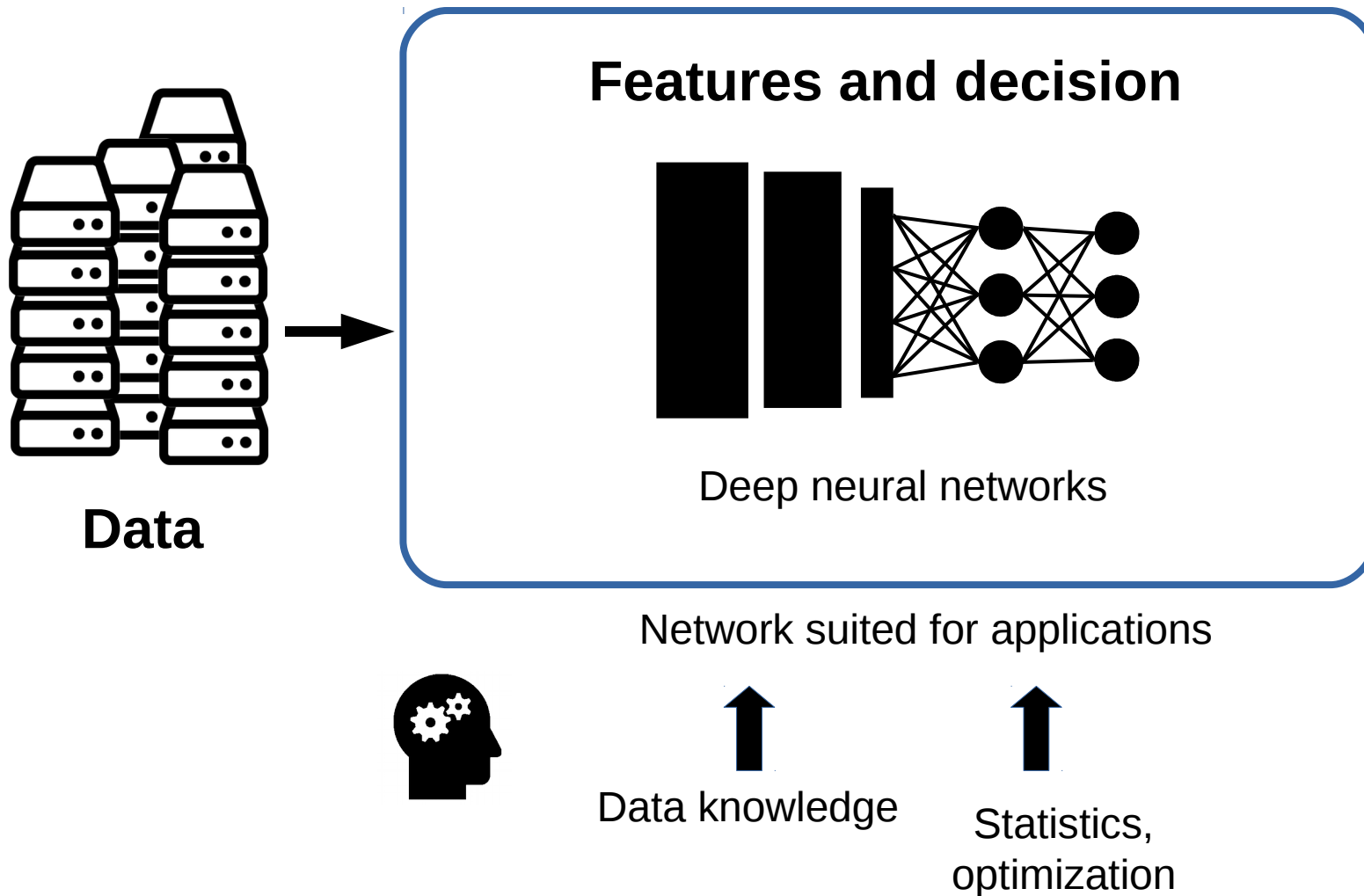




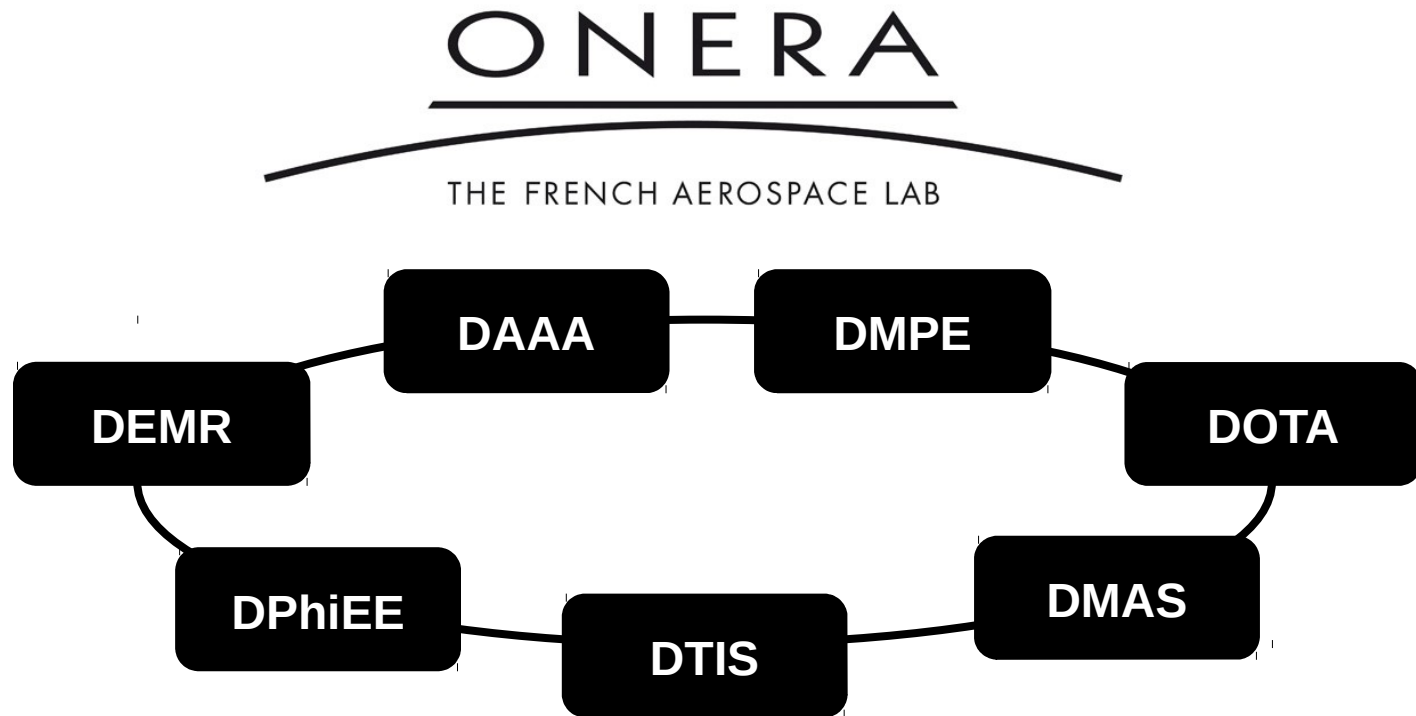
# Deep learning: a massively data driven approach



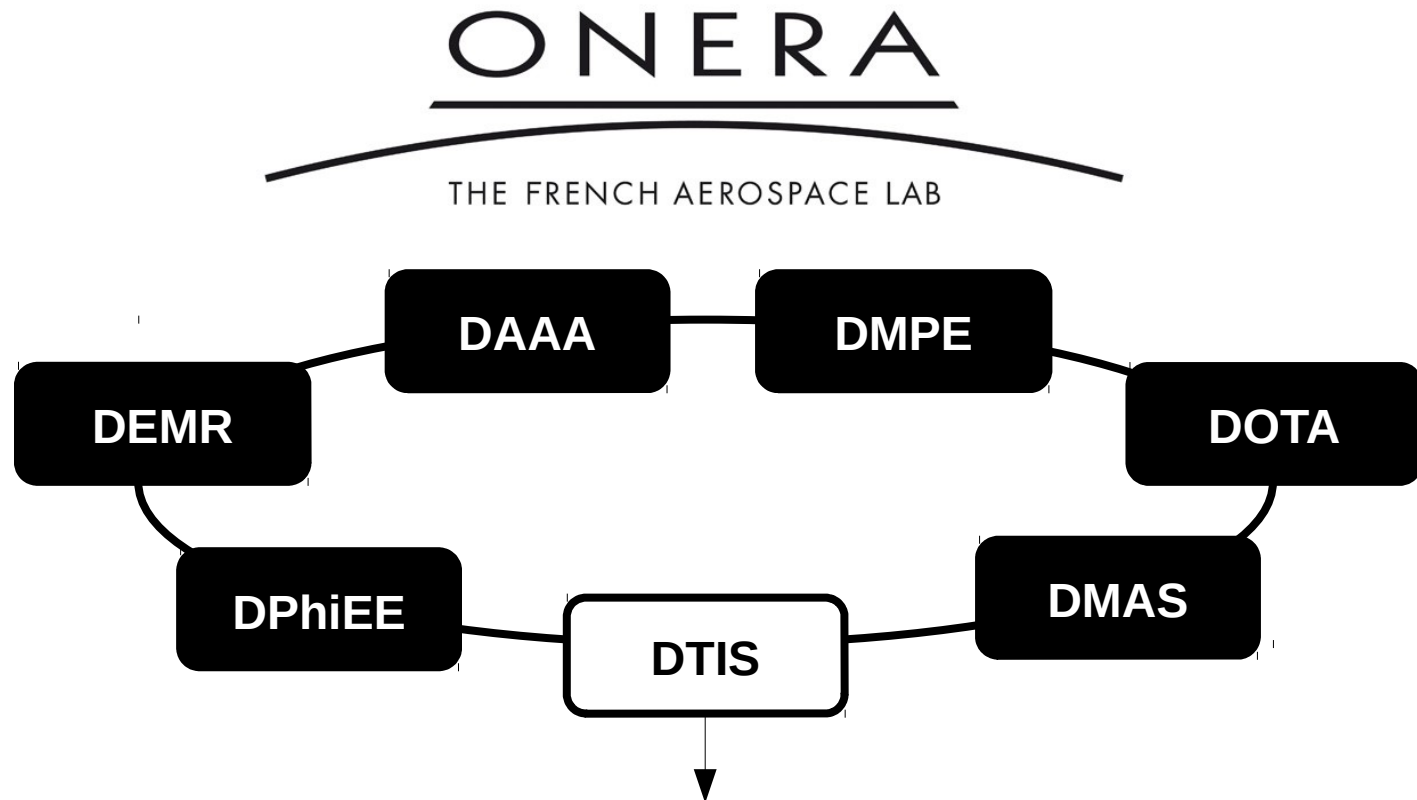
# Deep learning: a massively data driven approach



# Machine learning at ONERA

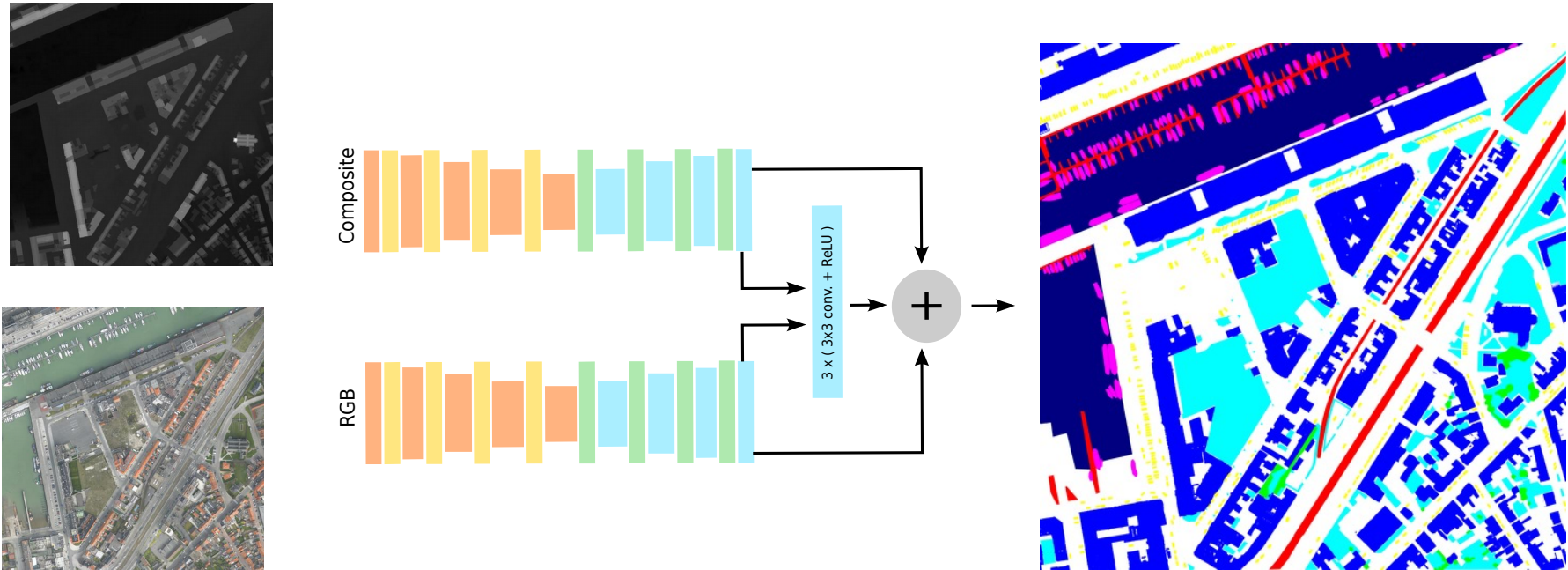


# Deep learning at ONERA



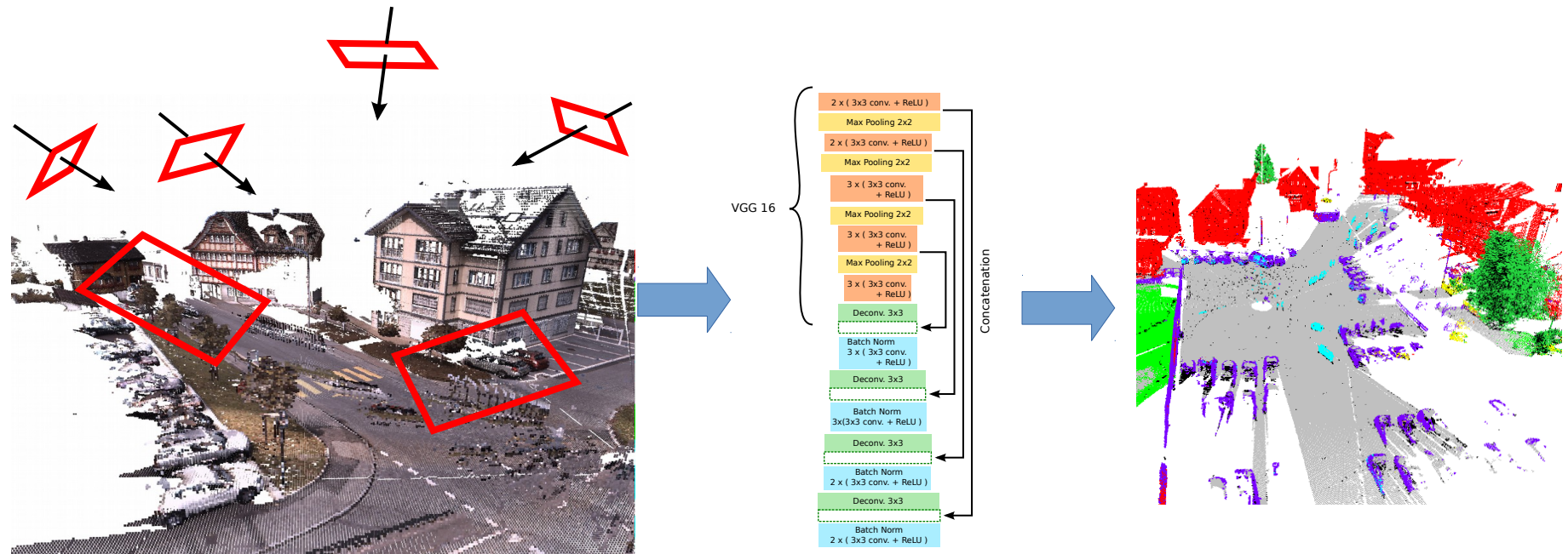
A. Chan-Hon-Tong, S. Herbin, B. Le Saux, A. Boulch ...

# Semantic Map labeling



Aerial images, multimodal (RGB, IR, DSM, ...)  
Fusion networks  
PhD Nicolas Audebert ([nicolas.audebert.at](mailto:nicolas.audebert.at))

# Point cloud labeling

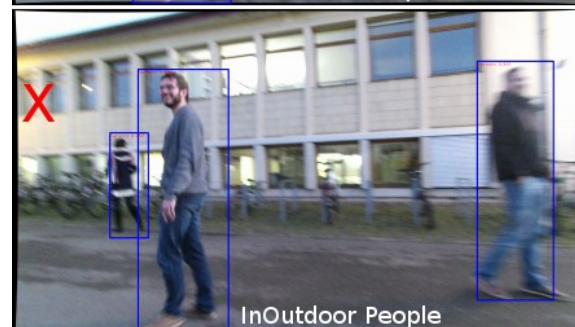
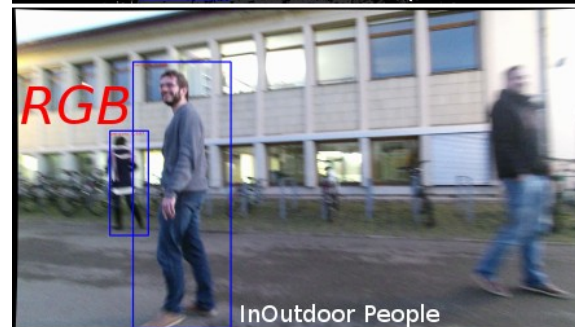
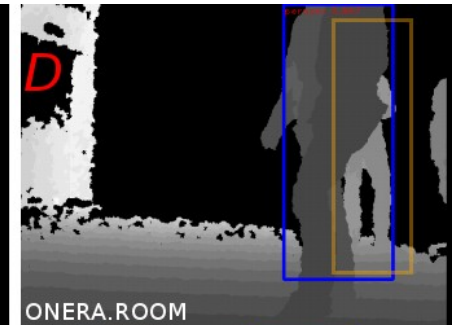
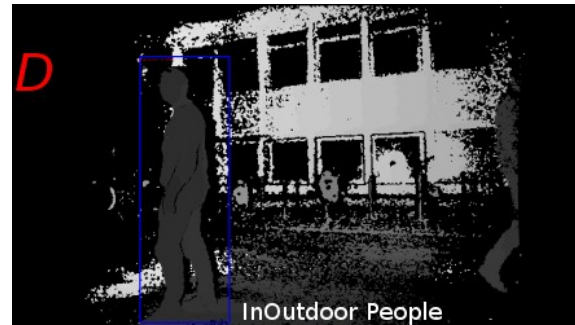


Leader on Semantic 8 LIDAR dataset  
 Transfer to photogrammetry  
 Code available online (DeLTA website)

# Detection

RGB and Depth  
for person  
detection  
improvement

PhD Joris Guery  
jorisguerry.fr

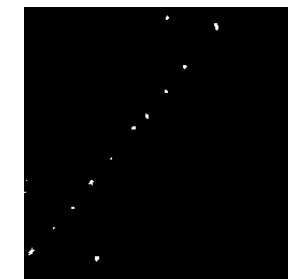
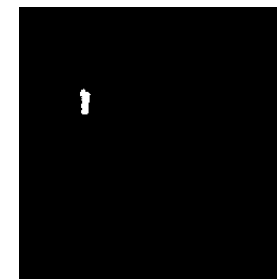
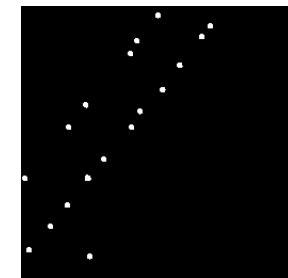
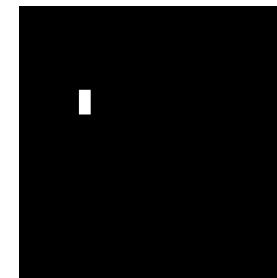
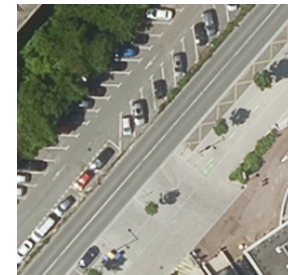
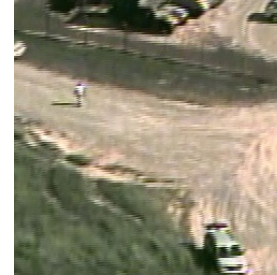




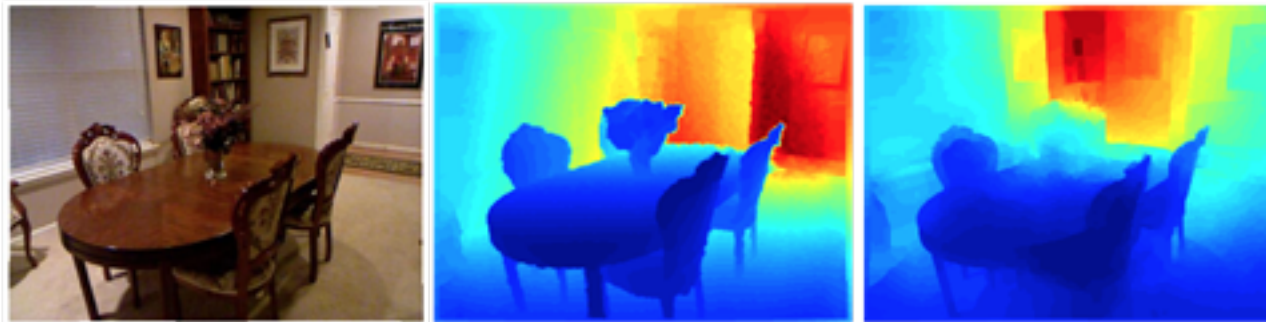
# Detection

Detection in low  
resolution  
Images  
Exploitation of images  
Sequences for detection

Juliette Chataigner  
(Intern)



# Depth from defocus



Sensor specific processing Depth from de focus.

PhD Macella Carvalho

# Zero Shot Learning

American Goldfinch



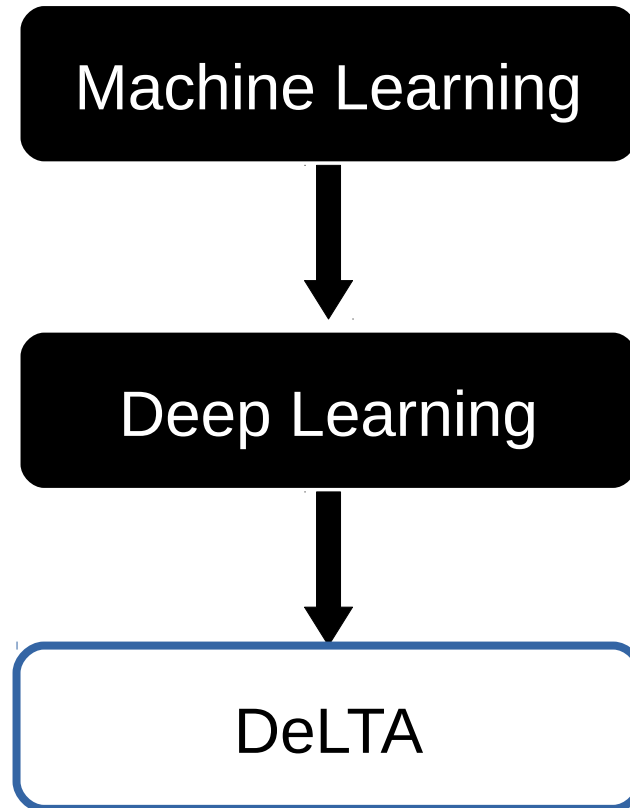
**Intuitive!**

Attribute	Has?
Beak longer than head	✗
Solid yellow belly	✓
Black and white wings	✓
⋮	⋮

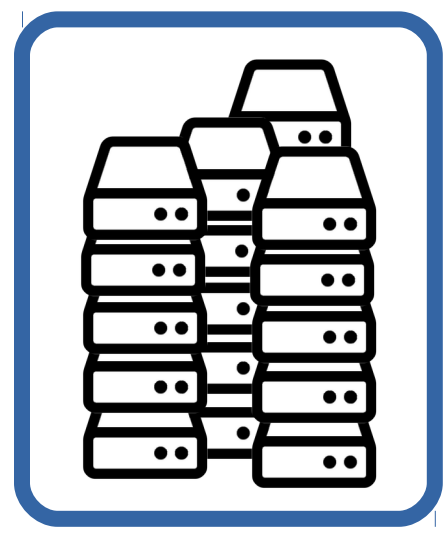
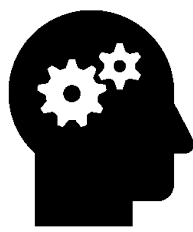
Zero-Shot Learning via Visual Abstraction  
Stanislaw Antol, Larry Zitnick, Devi Parikh

Zero Shot Learning  
Learning based on attributes  
PhD Maxime Bucher

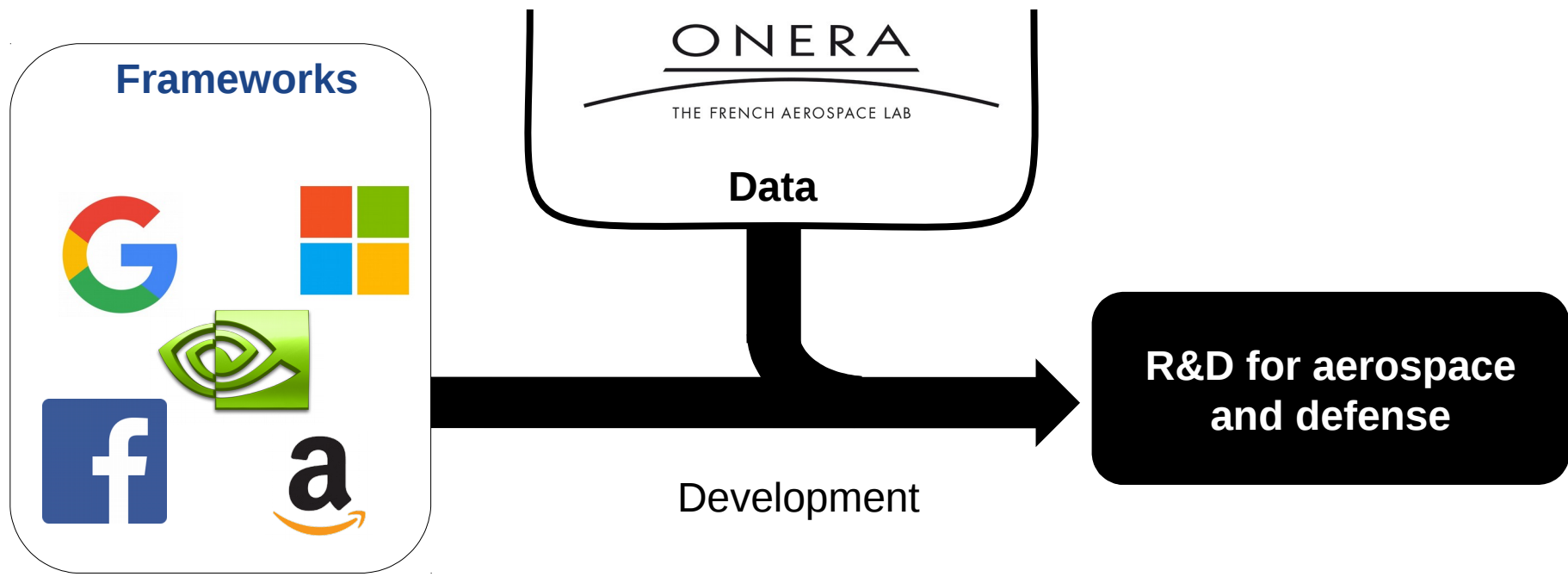
# Overview



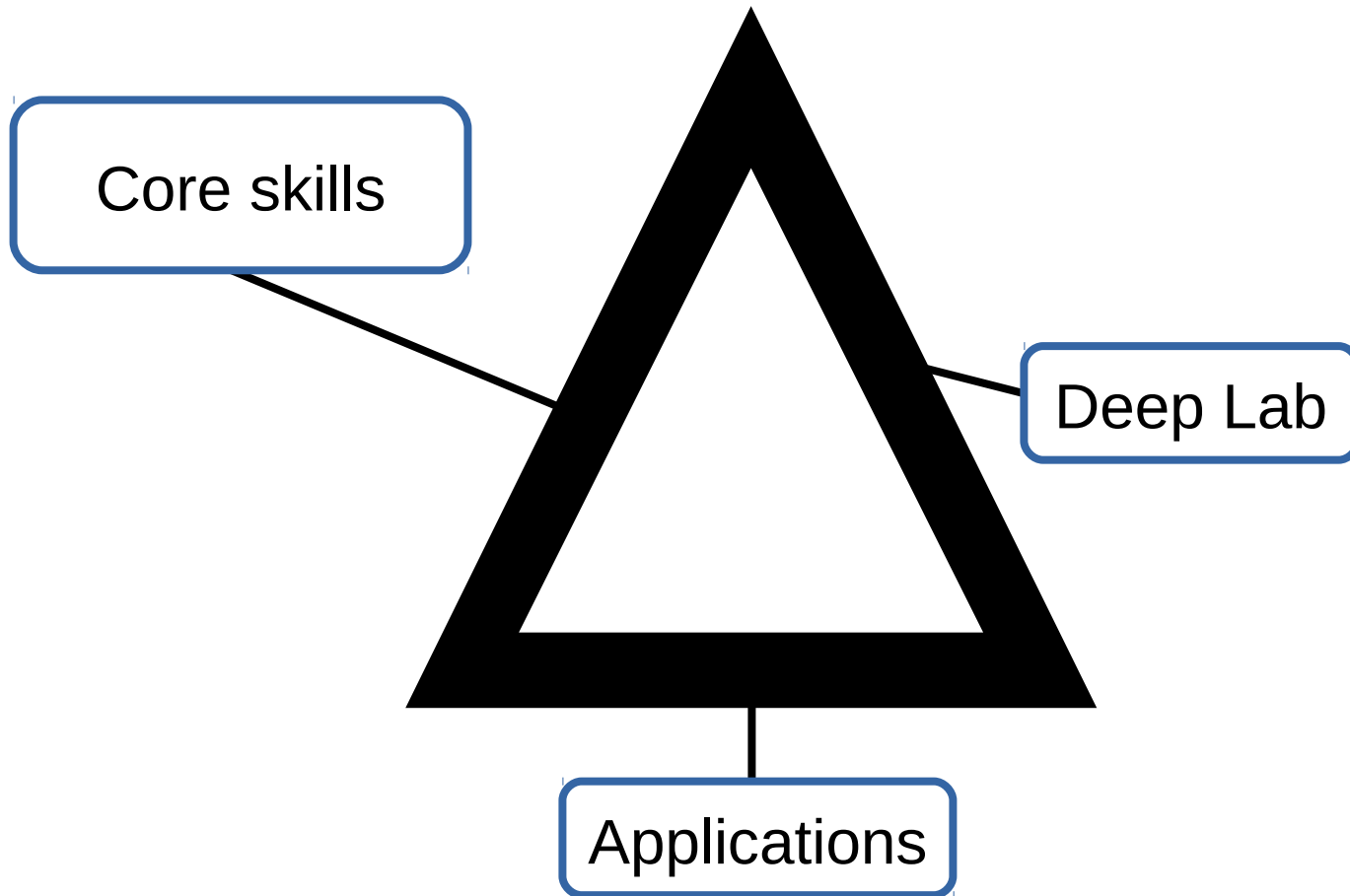
# Deep learning for aerospace $\Rightarrow$ ONERA



# Deep learning for aerospace $\Rightarrow$ ONERA



# LE PRF DeLTA



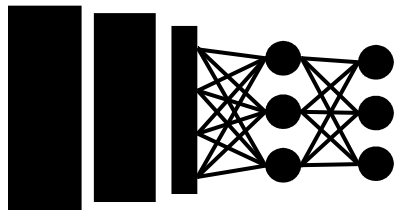




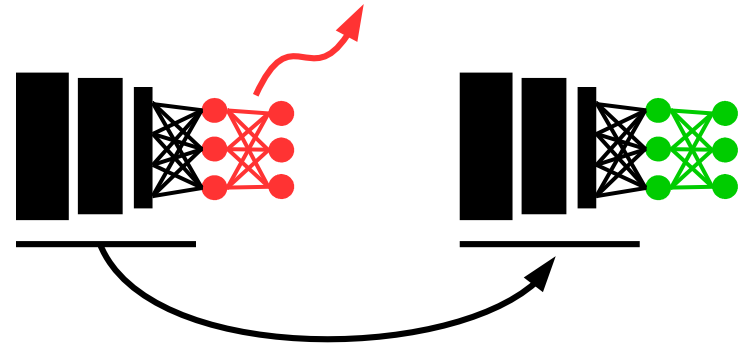
Databases



State of the art



New architectures



Domain adaptation

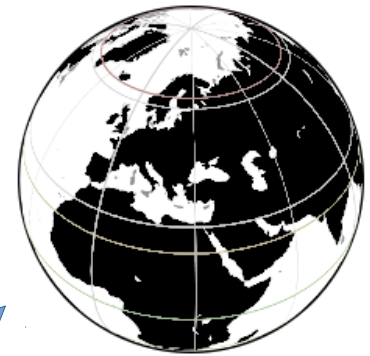
Core skills



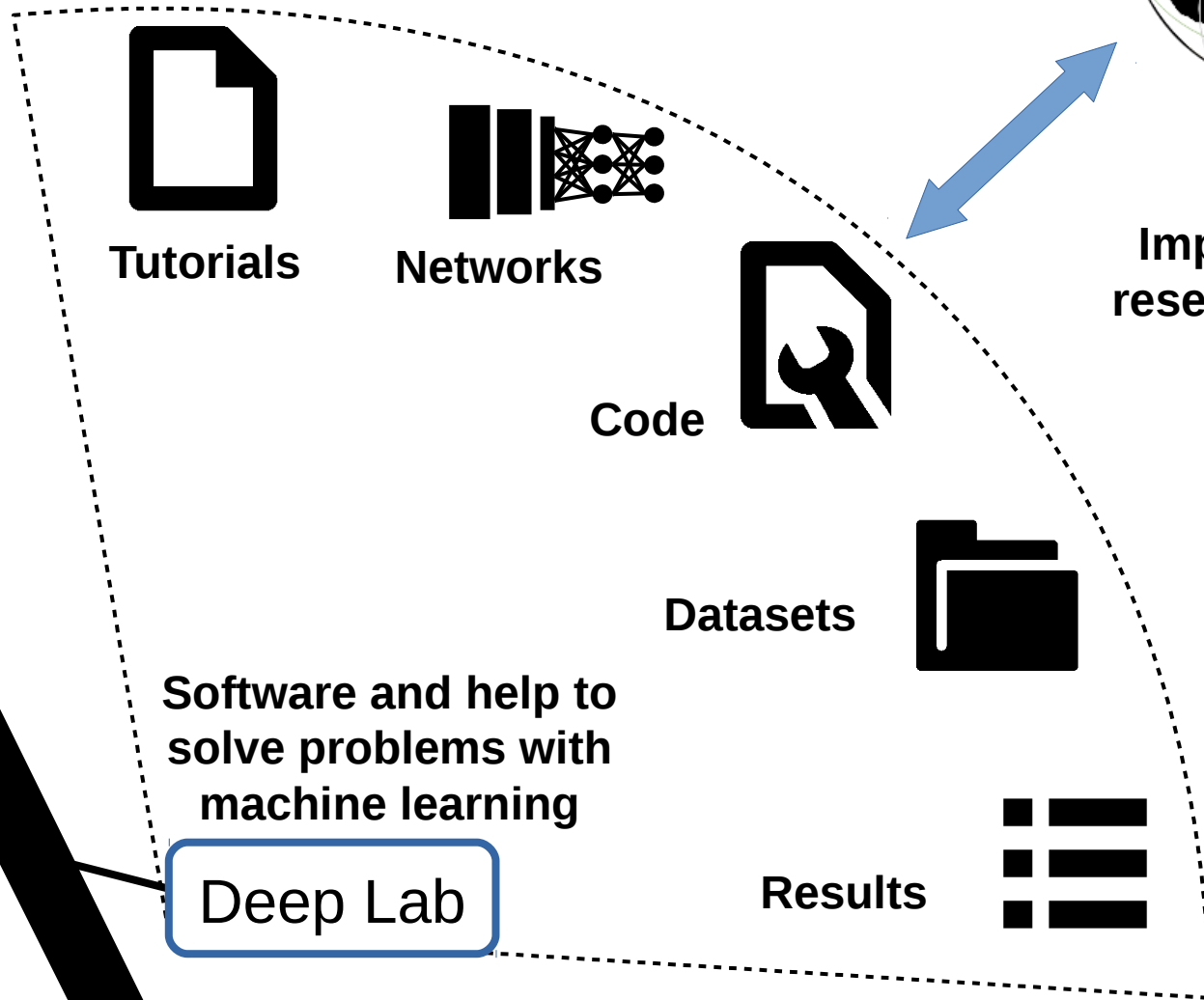
ONERA

THE FRENCH AEROSPACE LAB

# LE PRF DeLTA



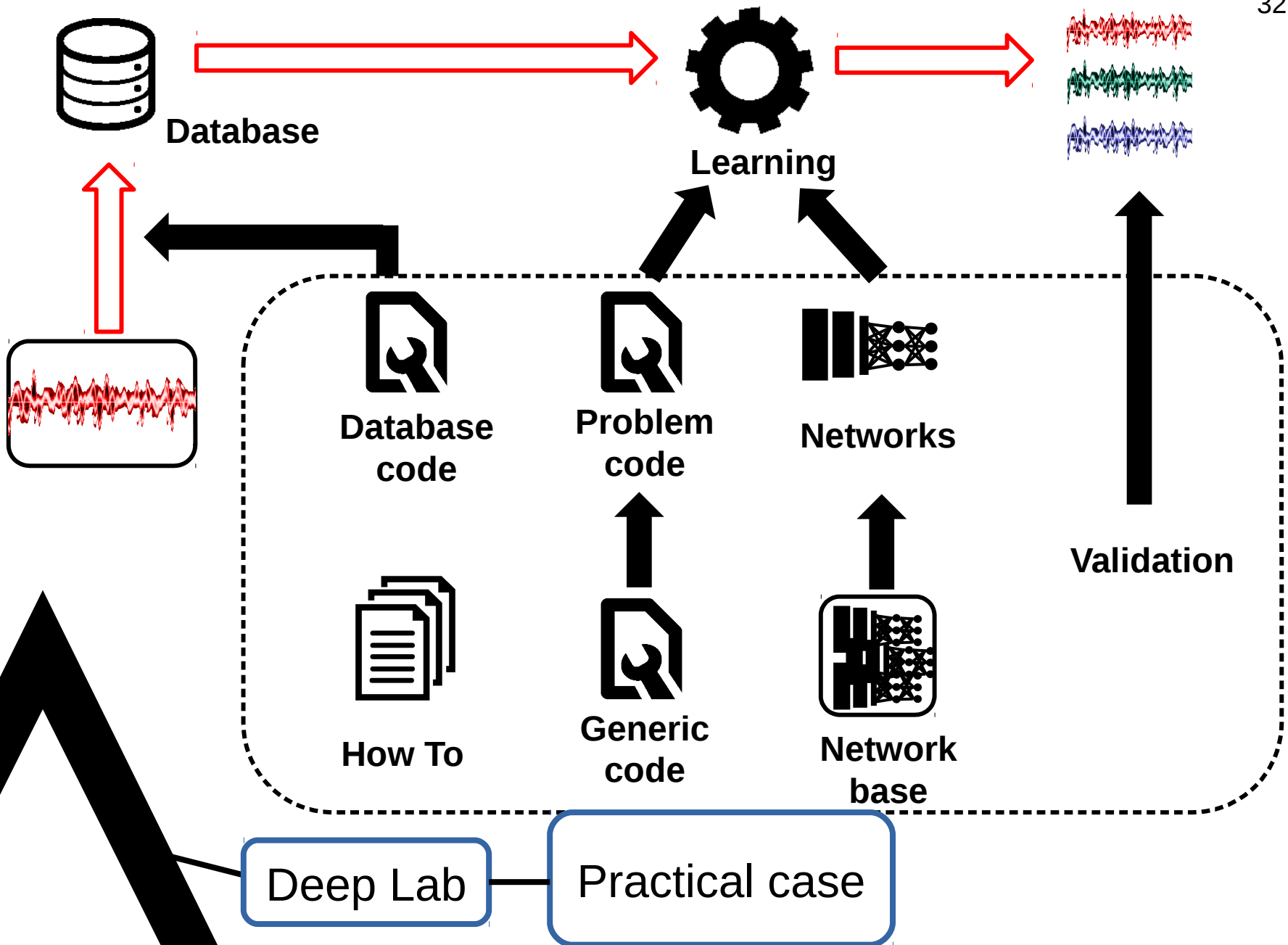
Academics and  
industrials

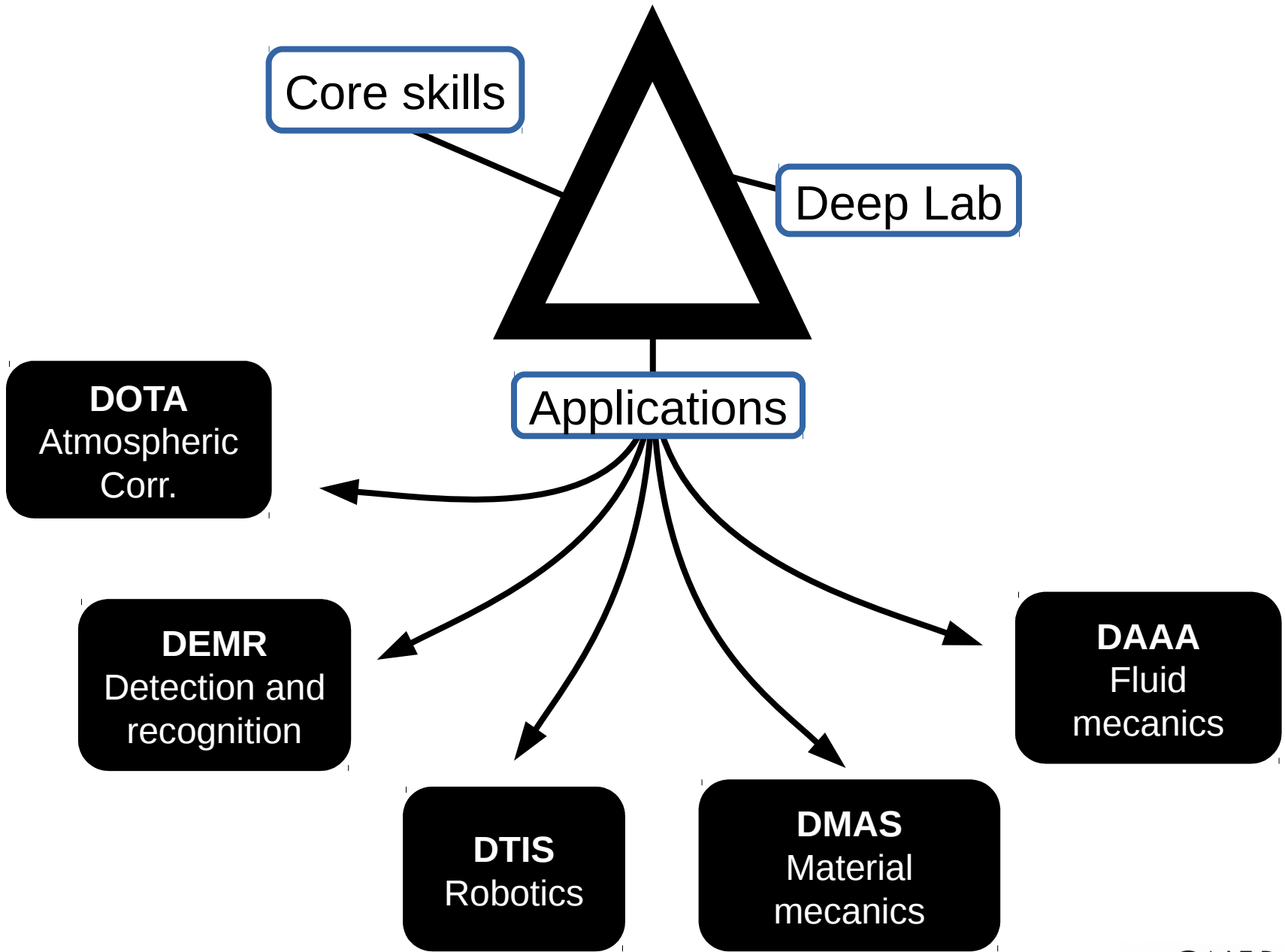


Improve ONERA  
research exposure

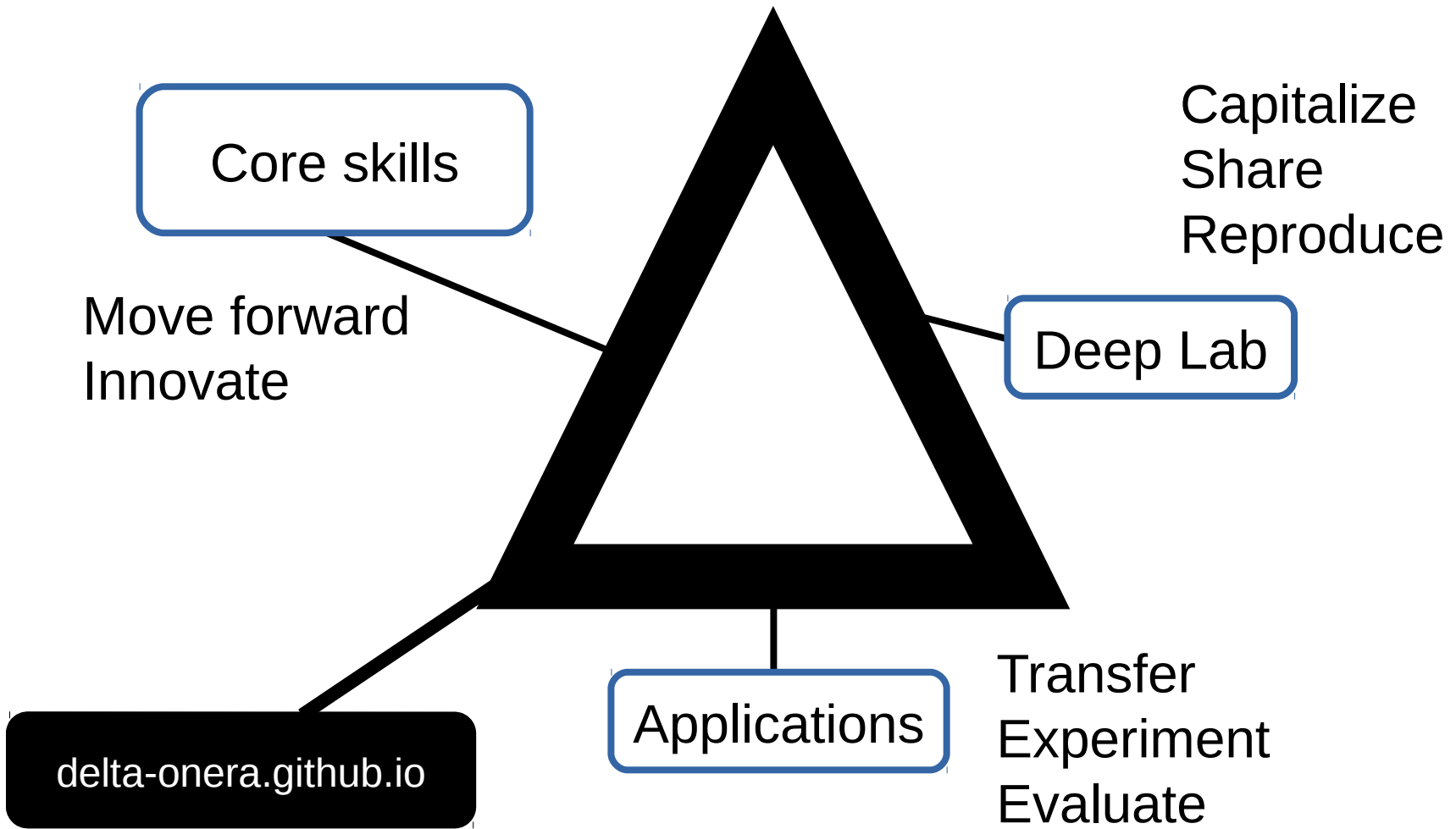
Software and help to  
solve problems with  
machine learning

Deep Lab





# 4 year project





*“We chose it because we deal with huge amounts of data.  
Besides, it sounds really cool.”*

**Larry Page - Google**