

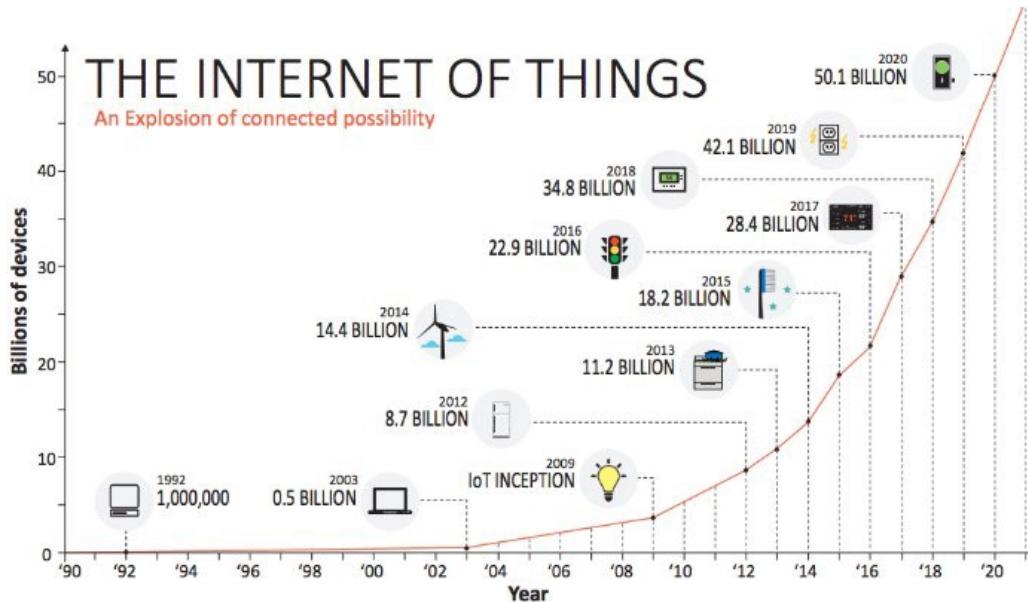
# Edge Computing

Master 's Degree in Informatics Engineering



# Current situation – Internet of Things

The number of interconnected devices is growing exponentially



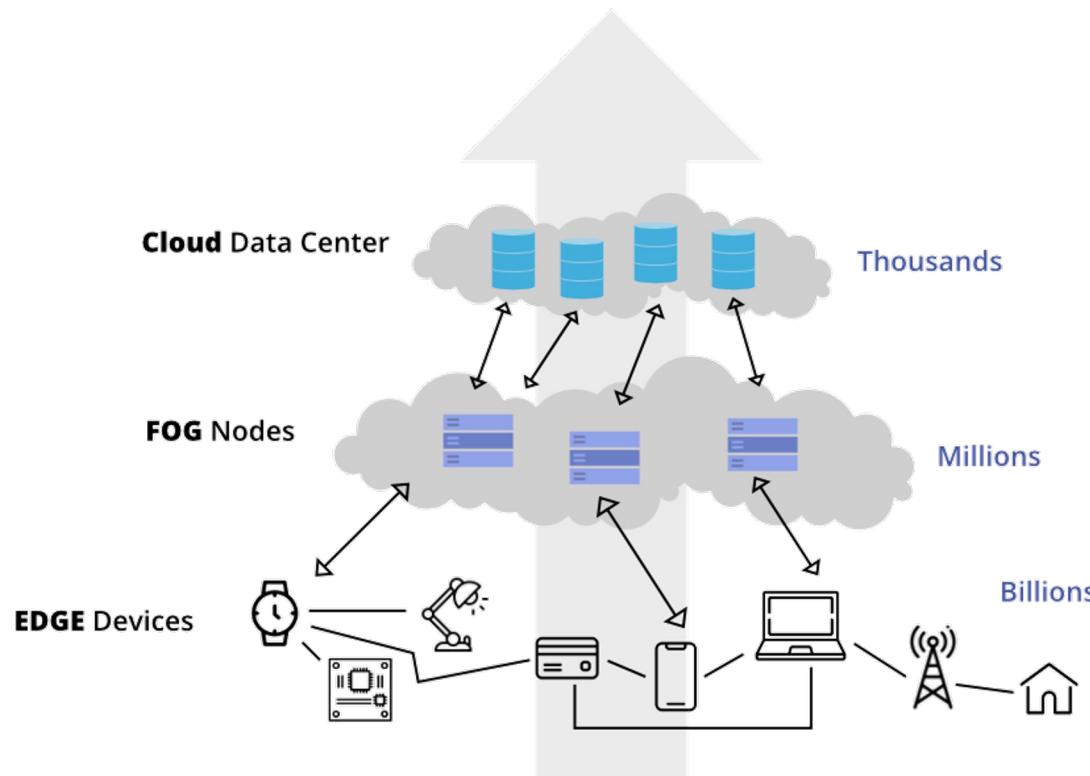
- From 9.7 billion in 2020 to more than 29 billion IoT devices in 2030.
- The total amount of data created, captured, copied, and consumed globally is forecast to increase rapidly, reaching 64.2 zettabytes ( $10^{21}$ ) in 2020. In 2025 is projected to grow to more than **180** zettabytes.
- This is 277 times greater than the amount of data end-user devices will transmit to data centers, and 47 times greater than projected total data center traffic.



# Current situation – Internet of Things

Open questions:

1. How to perform effective analysis on this huge amount of data.
2. All data is really necessary?

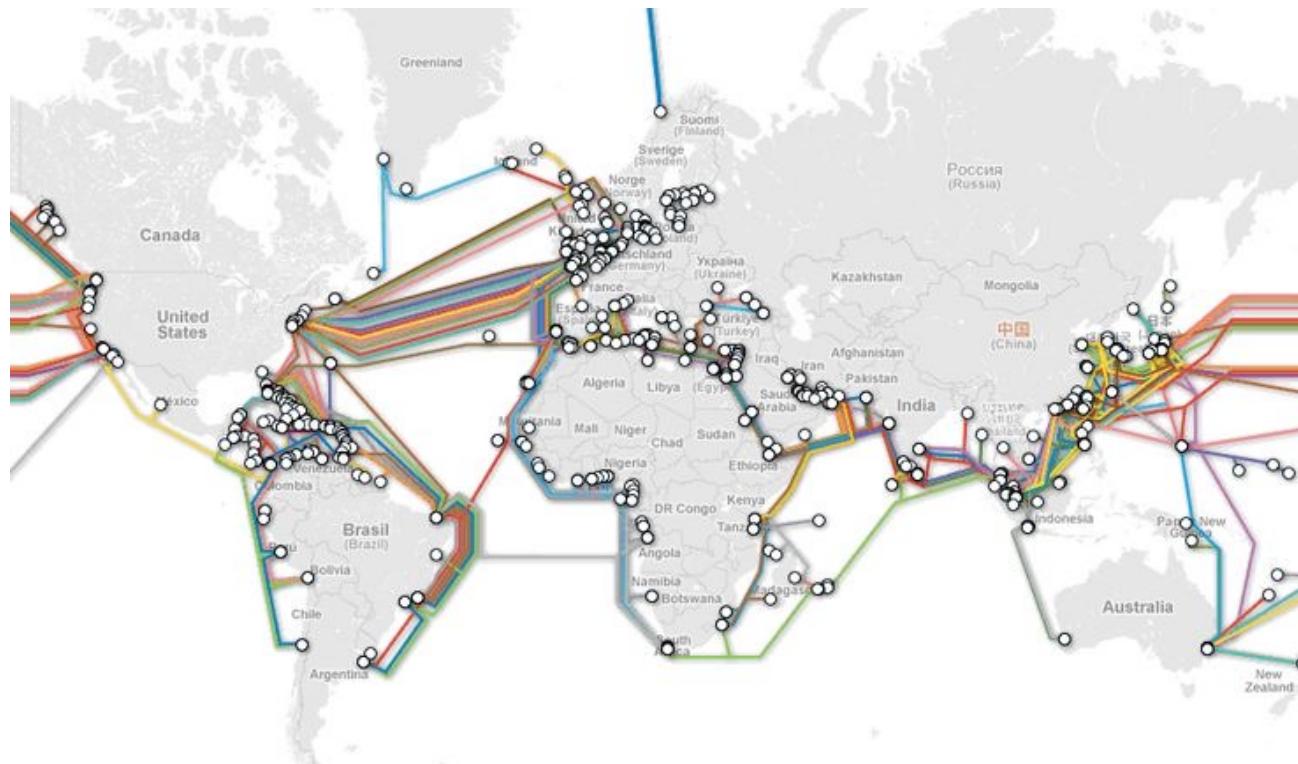




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### CLOUD COMPUTING SERVICE PROVIDERS

• MICROSOFT AZURE



• AMAZON WEB SERVICES



• GOOGLE CLOUD PLATFORM

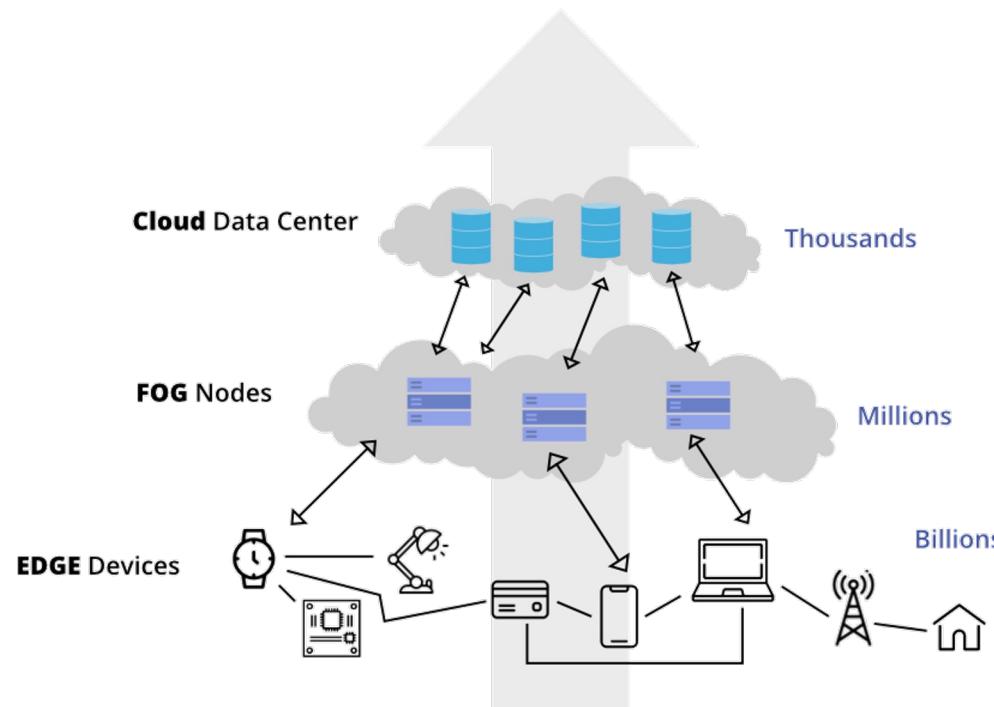




# Current situation – Internet of Things

Open questions:

1. How to perform effective analysis on this huge amount of data.
2. All data is really necessary?
3. Where the analysis results are required? Data privacy





# Current situation – Internet of Things

Open questions:

1. How to perform effective analysis on this huge amount of data.
2. All data is really necessary?
3. Where the analysis results are required?
4. Minimum allowable time to obtain the results? Data Latency



*"To achieve a round-trip time (RTT) of less than 1 millisecond, the maximum distance between a mobile device and a cloud can be no greater than around 100km."*

Commercial fibre optic > 2/3 speed of light

Route	Distance light in vacuum	Time, light in vacuum	Time, light in fiber	Round-trip time (RTT) in fiber
New York to San Francisco	4,148 km	14 ms	<b>21 ms</b>	42 ms
New York to London	5,585 km	19 ms	<b>28 ms</b>	56 ms

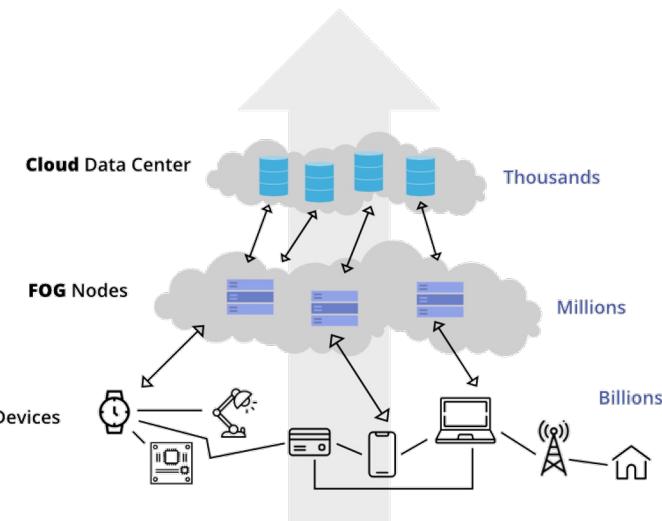


# About Edge Computing

1. Computing paradigm that offloads computation and storage from centralized Cloud to the network's logical extremes.

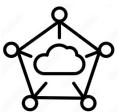
2. Benefits:

- Speed
- Security
- Scalability
- Versatility
- Faster decisions making on IoT
- Computation and Data analysis in disconnected environments



3. Use Cases:

- 5G Applications
- Smart Cities
- Self Driving Cars



# Edge Computing - Devices

Small devices implies:

1. Classic situations:

- Soft/easy devices control
- Classification
- Identification
- Malfunctioning situations

2. Extremely low amount of memory

Programs and memory usage must be optimized

3. Take control on any environment situation requires complex heuristics

## Solution

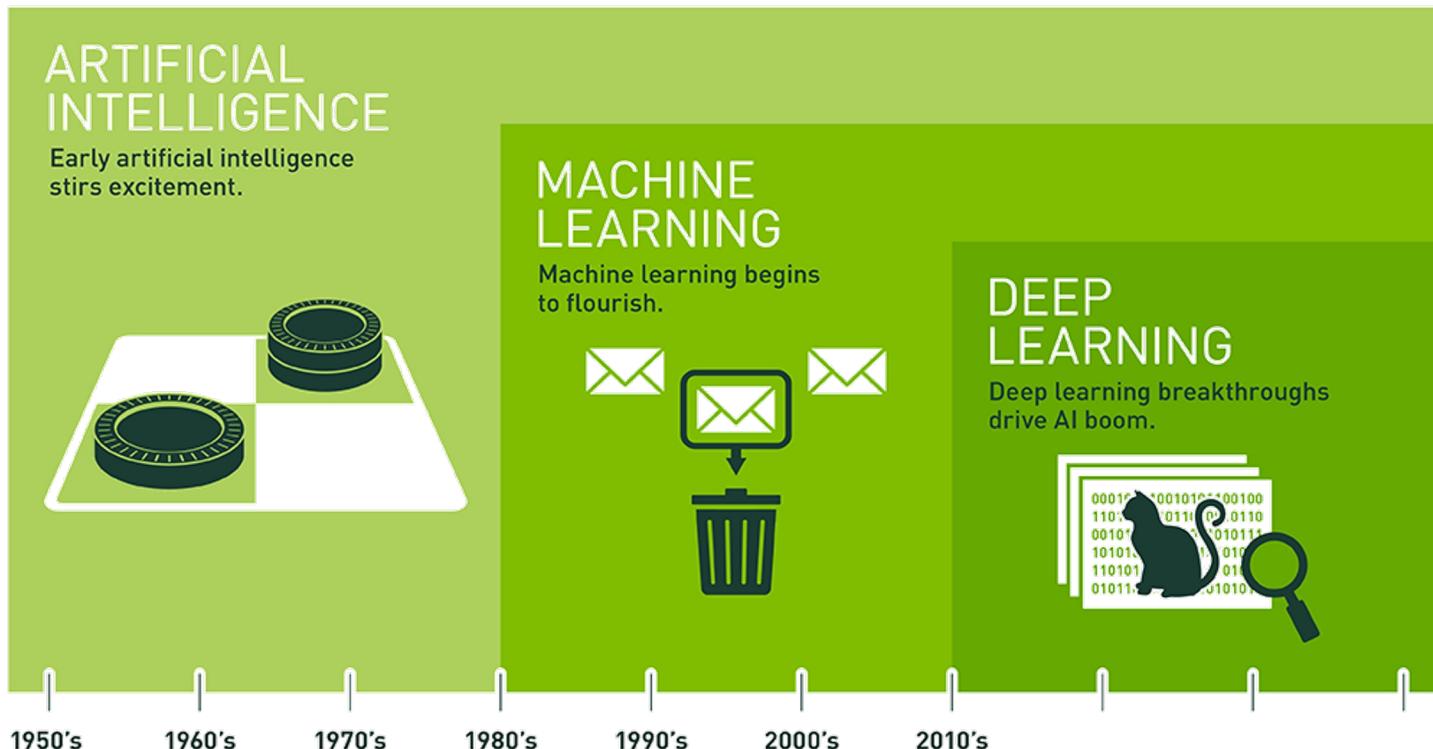
>> Machine Learning > Deep Learning

Simple algorithm with affordable computational requirements.

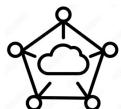


# Deep Learning concepts

- Deep learning is a subfield of machine learning focusing on **learning data representations** as successive layers of increasingly meaningful representations.



Since an early flush of optimism in the 1950s, smaller subsets of artificial intelligence – first machine learning, then deep learning, a subset of machine learning – have created ever larger disruptions.



# Deep Learning concepts

Layers:

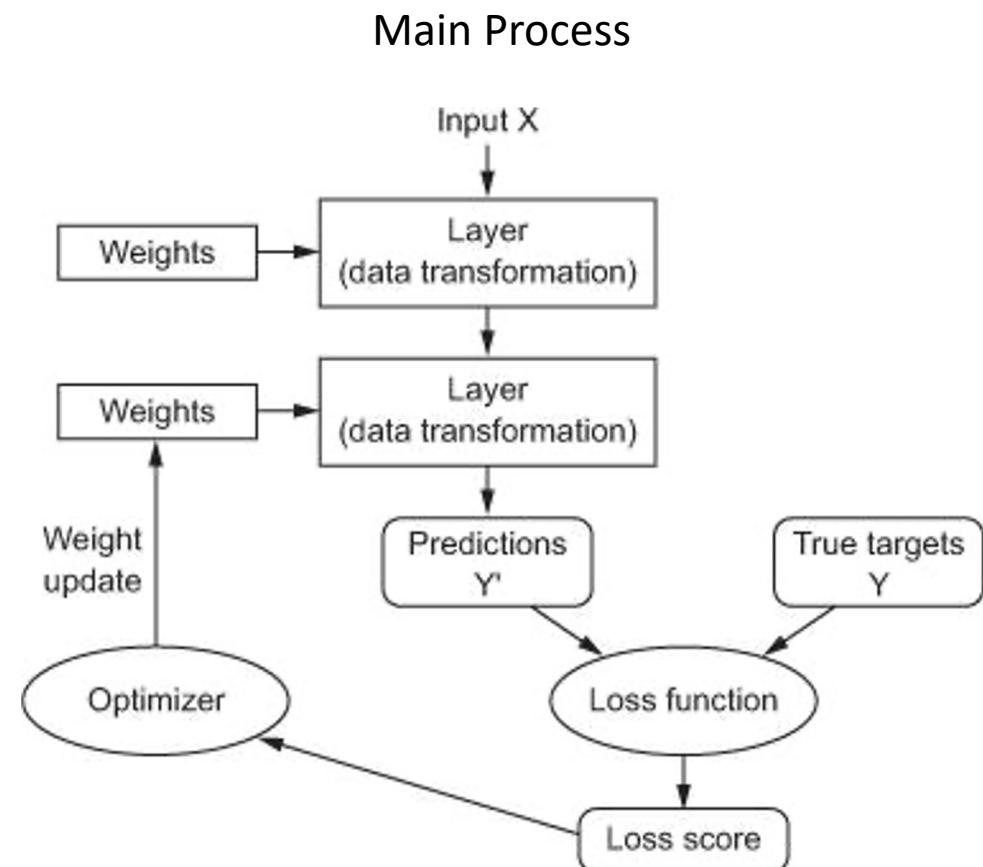
- Data Processing modules
- Input/output. Multiple tensors
- Defined by states/weights combined by a network

Training process:

- Predictions are compared with the input targets

Loss function:

- Represents the acceptable accuracy

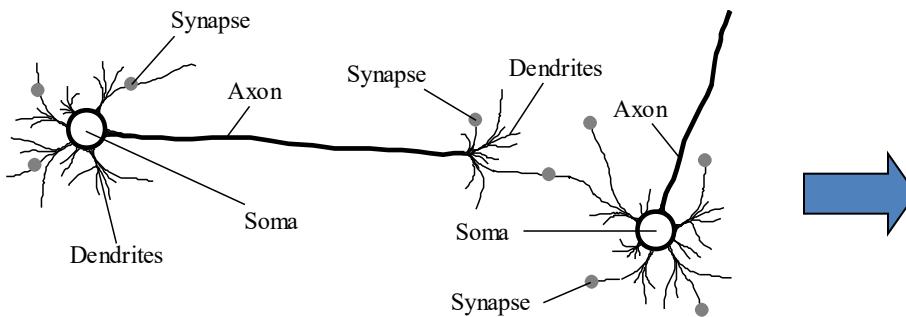




# Deep Learning concepts – Neural Networks

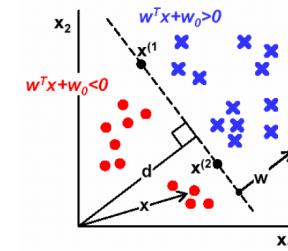
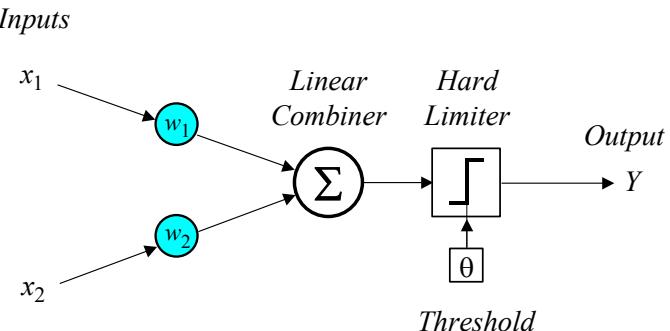
Human neural network:

- Neuron switching time:  $\sim 0.001$  second
- Number of neurons:  $\sim 10^{10}$
- Connections per neuron:  $\sim 10^{4\sim 5}$
- Scene recognition time:  $\sim 0.1$  second



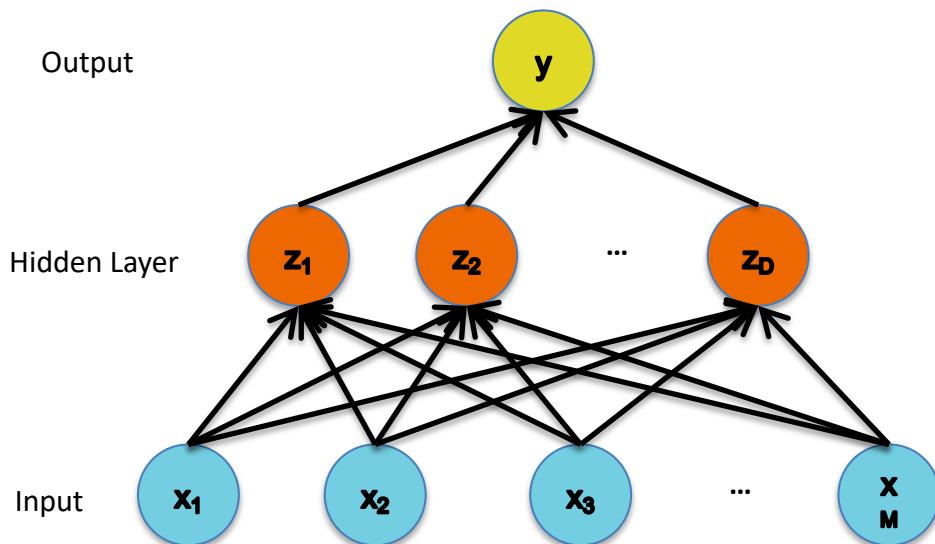
$$X = \sum_{i=1}^n x_i w_i$$

$$y = \begin{cases} +1, & \text{if } X \geq \omega_0 \\ -1, & \text{if } X < \omega_0 \end{cases}$$



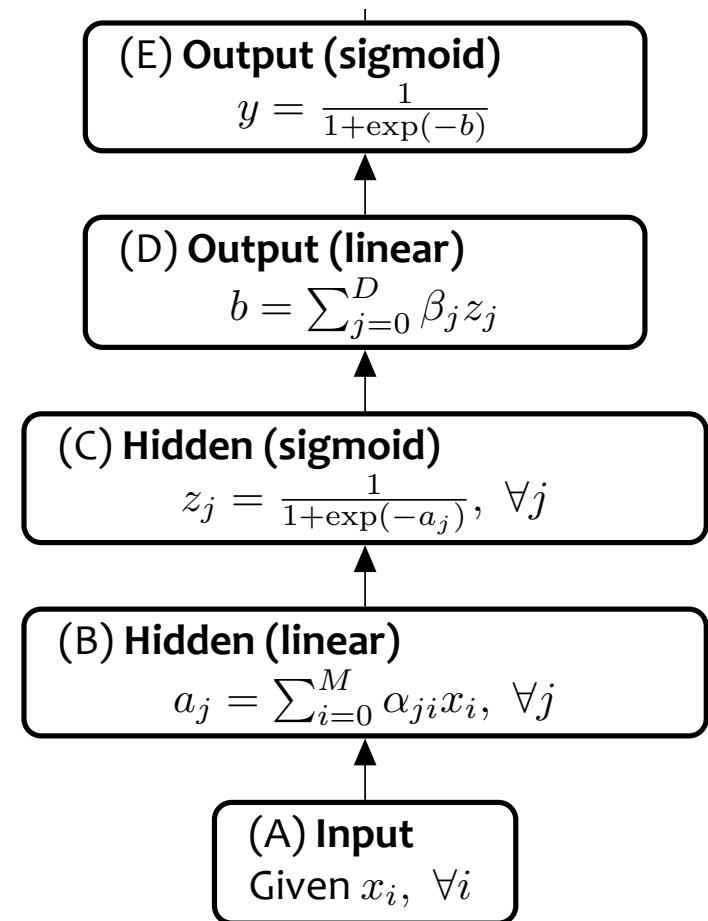


# Deep Learning concepts – Neural Networks



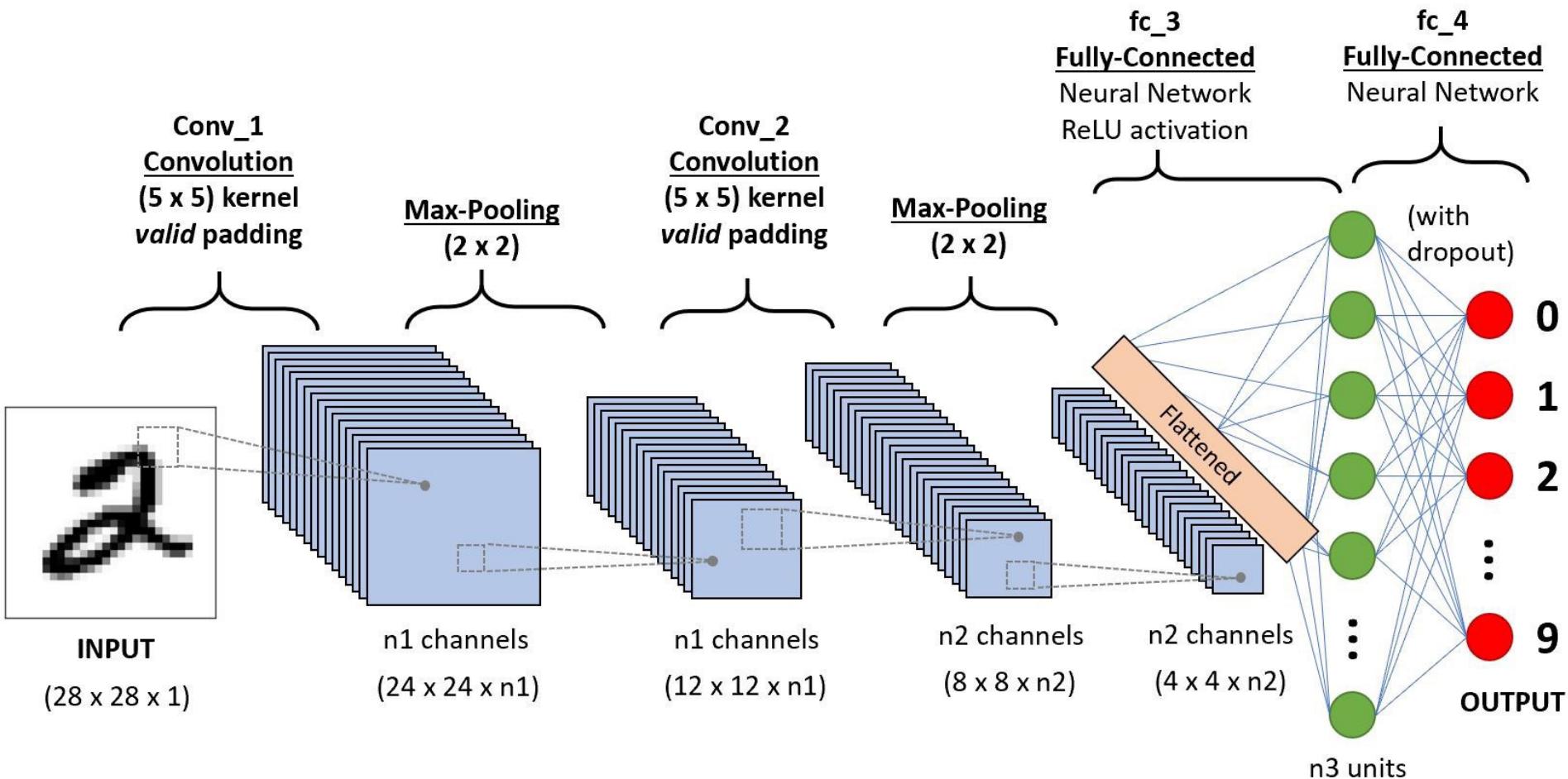
Complex architecture

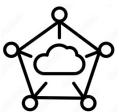
- # of hidden layers? (depth)
- # of units per hidden layer? (width)
- Type of activation function (nonlinearity)
- Form of objective function?



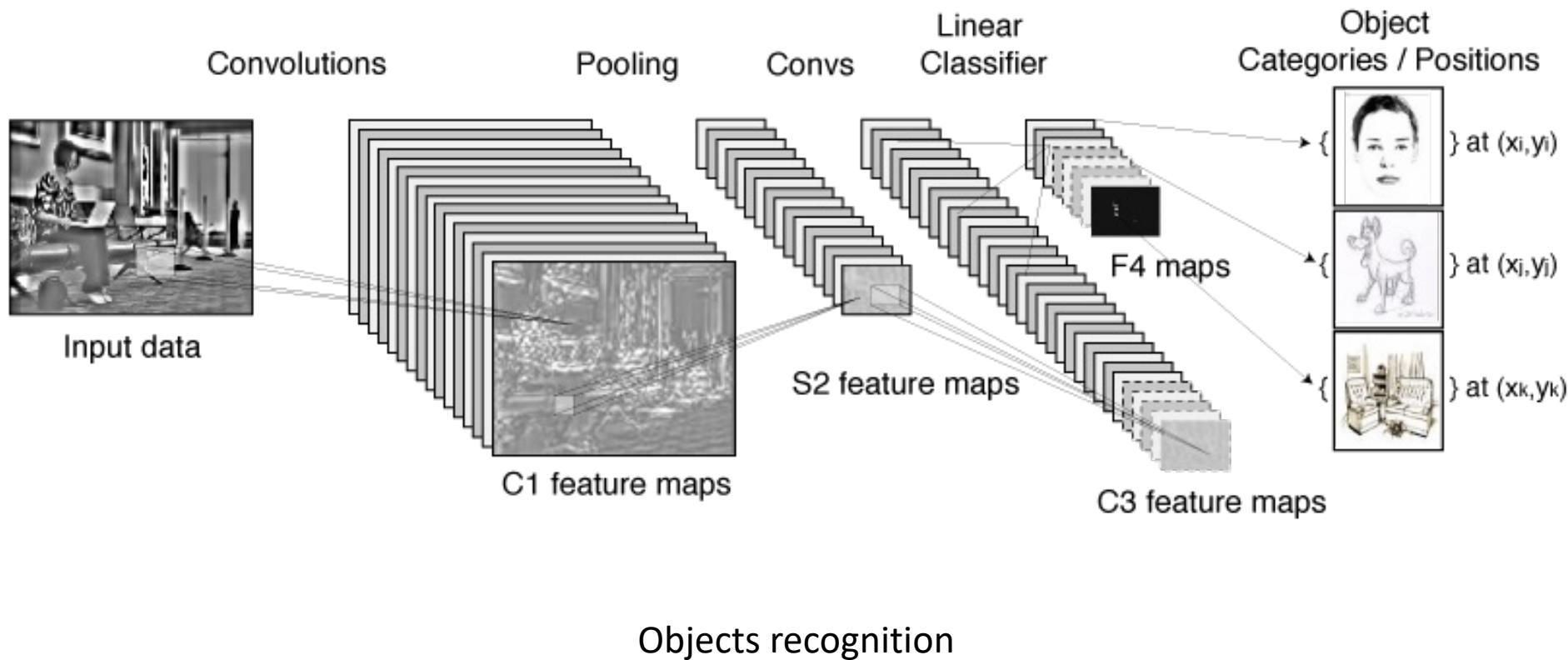


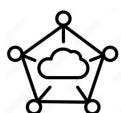
# Deep Learning concepts – Neural Networks



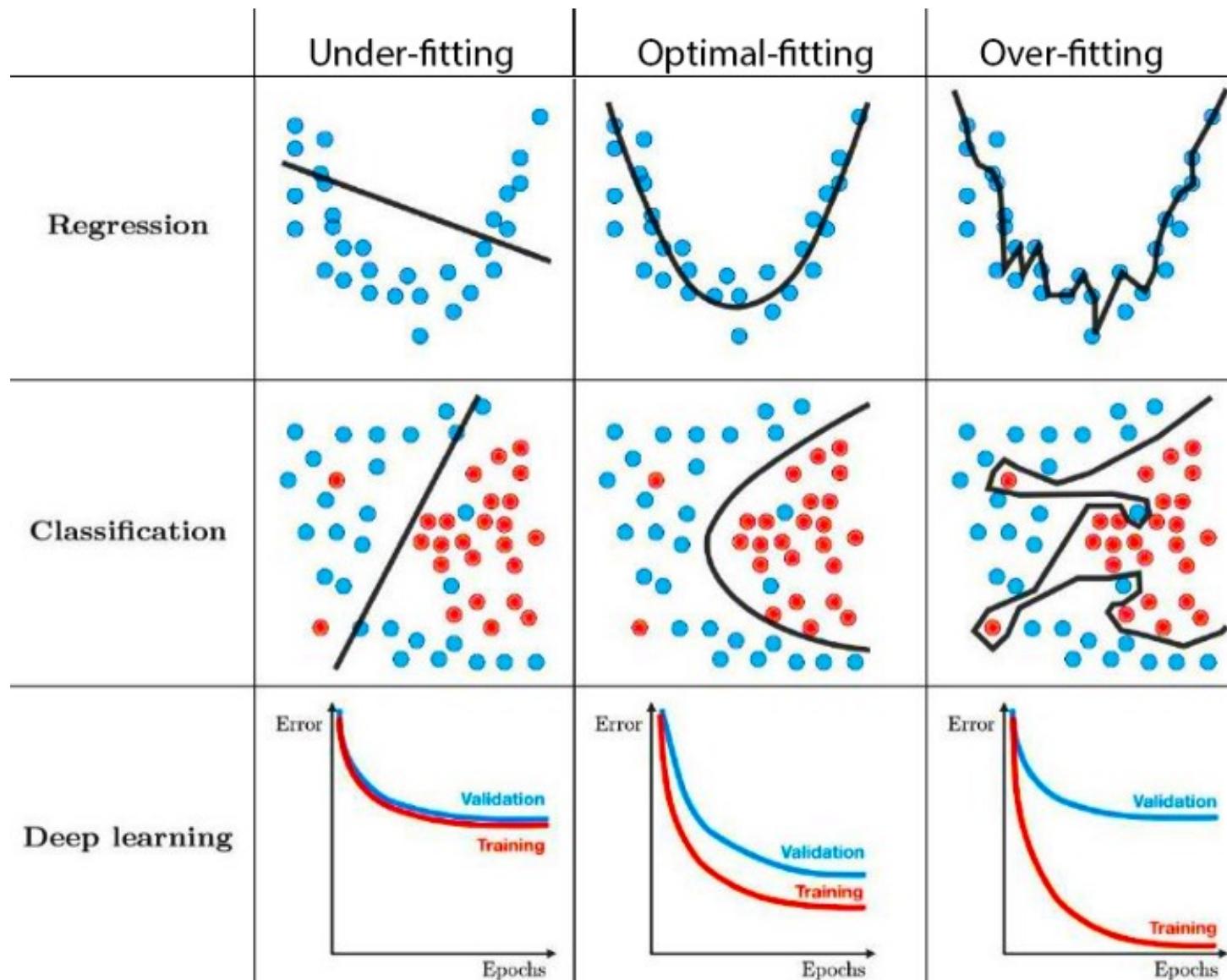


# Deep Learning concepts – Neural Networks





# Deep Learning concepts – Neural Networks

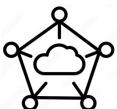




## Neural Networks Attributes

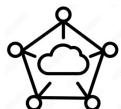
- **Adaptive Learning:** Neural networks model non-linear and complex relationships and build on previous knowledge.
- **Self-Organization:** It is possible to redefine the inner structure (synapsis) allowing to cluster and classify vast amounts of data.
- **Real-Time Operation:** Neural networks can (sometimes) provide real-time answers (they are based on basic computational operations).
- **Prognosis:** Ability to predict based on models.
- **Fault Tolerance:** When significant parts of a network are lost or missing, neural networks can redefine their organization and refill the blanks.

>> Main drawback – It requires a learning process and in some cases reinforcement learning



## Neural Networks – Main use

- **Event prediction and simulations:** Production of expected output values based on incoming data.
- **Recognition and classification:** Association of patterns and organization of data sets in predefined classes. Even identifying unique features without prior data.
- **Data processing and modelling:** Data validation, aggregation and analysis. Design and troubleshooting in complex software systems.
- **Control engineering:** Monitoring of computer systems and manipulation of robots. Including the creation of autonomous systems and robots.
- **Artificial Intelligence:** Forming part of the deep learning and machine learning technologies that are fundamental parts of artificial intelligence



# EDGE IMPULSE

DATA ACQUISITION (ANOMALY DETECTION)

Training data | Test data | Export data

DATA COLLECTED 10m 45s

TRAIN / TEST SPLIT 79% / 21%

Collected data

SAMPLE NAME	LABEL	ADDED	LENGTH
Mode 1.2ned0e2.s3	Mode 1	Today, 20:26:10	3s
Mode 1.2ned0e2.s2	Mode 1	Today, 20:26:10	3s
Mode 1.2ned0e2.s1	Mode 1	Today, 20:26:10	3s
Mode 1.2nebrb8o.s25	Mode 2	Today, 19:43:55	3s
Mode 1.2nebrb8o.s24	Mode 2	Today, 19:43:55	3s
Mode 1.2nebrb8o.s23	Mode 2	Today, 19:43:55	3s
Mode 1.2nebrb8o.s22	Mode 2	Today, 19:43:55	3s
Mode 1.2nebrb8o.s21	Mode 2	Today, 19:43:55	3s
Mode 1.2nebrb8o.s20	Mode 2	Today, 19:43:55	3s
Mode 1.2nebrb8o.s17	Mode 2	Today, 19:43:55	3s
Mode 1.2nebrb8o.s16	Mode 2	Today, 19:43:55	3s
Mode 1.2nebrb8o.s14	Mode 2	Today, 19:43:55	3s

Record new data

Connect using WebUSB

Device: My device

Label: Mode 1

Sample length (ms.): 9000

Sensor: Built-in accelerometer

Frequency: 100Hz

Start sampling

RAW DATA  
Mode 1.2nebrb8o.s22



# Edge Impulse

Development platform for machine learning on edge devices, free for developers and trusted by enterprises.

<https://www.edgeimpulse.com/>

<https://docs.edgeimpulse.com/docs>

It is based on TinyML that allows to apply machine learning techniques on embedded devices.

Edge Impulse Algorithm / Model Deployment Options

 TINY  
ML

 Eta Compute

 NORDIC  
SEMICONDUCTOR

 hackster.io  
AN AVNET COMMUNITY

 ARDUINO

 SILICON LABS

 TensorFlow

 THE THINGS  
NETWORK

Arduino Nano 33 BLE Sense



Nordic Semi nRF9160 DK



TI CC1352P Launchpad



Arduino Nida Vision



Nordic Semi Thingy:53



Raspberry Pi RP2040



Arduino Portenta H7



Nordic Semi Thingy:91



Raspberry Pi 4



Espressif ESP 32



Open MV Cam H7 Plus



Linux x86\_64 + Macbook + Gateway



Himax WE-I Plus



Silicon Labs xG24



Nvidia Jetson Nano



Nordic Semi nRF52840 DK



Silicon Labs Thunderboard Sense 2



Smartphone



Nordic Semi nRF5340 DK



Sony's Spresense



Cloud



Syntiant Tiny ML Board

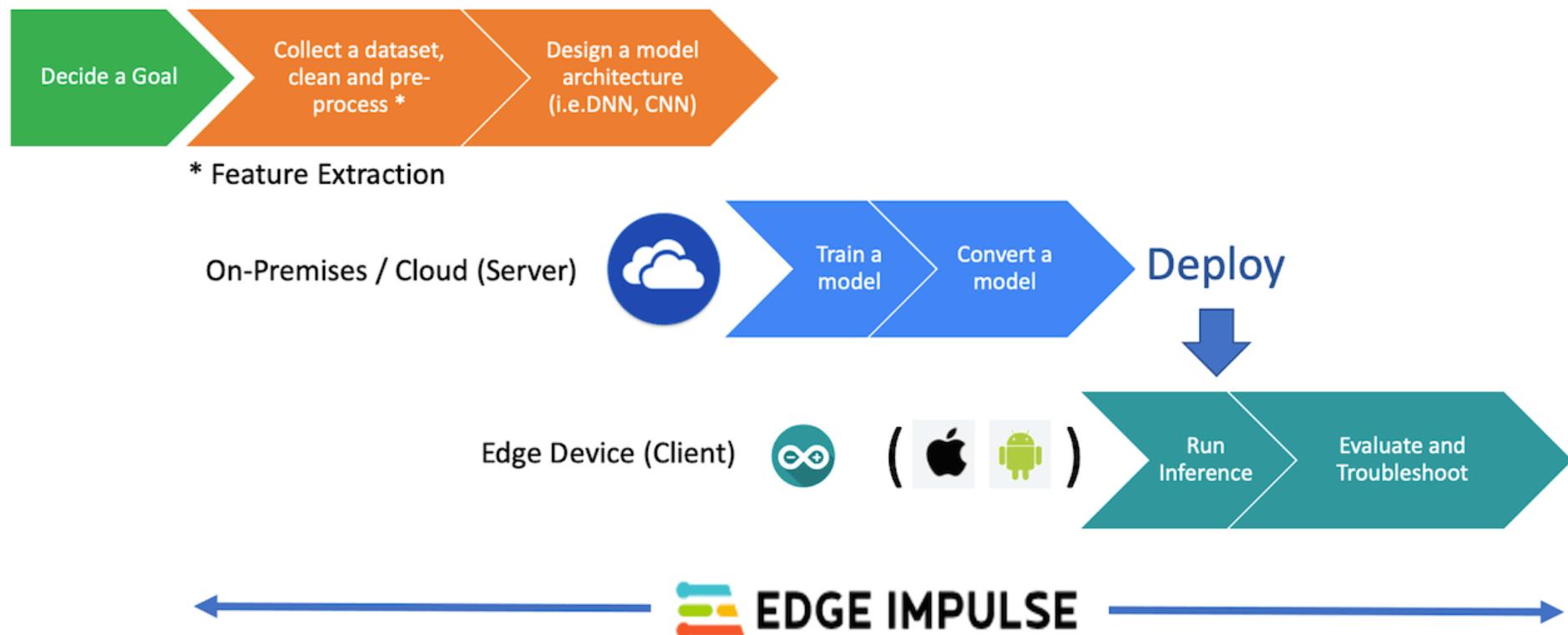


Your target hardware





# Edge Impulse Workflow





# Edge Impulse Example

## Building a Fall Detection System with Edge Impulse and a Notecard

<https://blues.io/blog/fall-detection/>

Japan has 36 million people aged 65 or older, and the number of fall-related deaths has increased in recent years. To help address this, Naveen Kumar built a device that detect falls with accelerometer data, and sends emergency notifications using a cellular Notecard.

