



Introduction to Deep Learning

ARTIFICIAL INTELLIGENCE

Early artificial intelligence stirs excitement.



MACHINE LEARNING

Machine learning begins to flourish.



DEEP LEARNING

Deep learning breakthroughs drive AI boom.



1950's

1960's

1970's

1980's

1990's

2000's

2010's

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.

- Predictive maintenance or condition monitoring
- Warranty reserve estimation
- Propensity to buy
- Demand forecasting
- Process optimization
- Telematics

Manufacturing



- Predictive inventory planning
- Recommendation engines
- Upsell and cross-channel marketing
- Market segmentation and targeting
- Customer ROI and lifetime value

Retail



- Alerts and diagnostics from real-time patient data
- Disease identification and risk stratification
- Patient triage optimization
- Proactive health management
- Healthcare provider sentiment analysis

Healthcare and Life Sciences



- Aircraft scheduling
- Dynamic pricing
- Social media – consumer feedback and interaction analysis
- Customer complaint resolution
- Traffic patterns and congestion management

Travel and Hospitality



- Risk analytics and regulation
- Customer Segmentation
- Cross-selling and up-selling
- Sales and marketing campaign management
- Credit worthiness evaluation

Financial Services



- Power usage analytics
- Seismic data processing
- Carbon emissions and trading
- Customer-specific pricing
- Smart grid management
- Energy demand and supply optimization

Energy, Feedstock, and Utilities

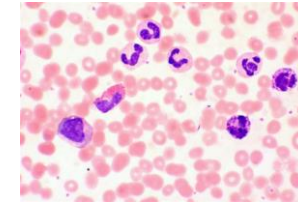


Aipoly video

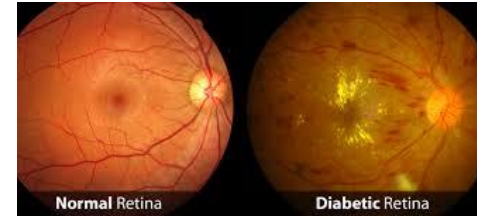
<https://www.youtube.com/watch?v=XMdct-5bERQ>

Deep Learning treads where others dare not

- **Computer vision** is now completely dominated by Deep Learning :
- **DeepMind**-detects diabetic retinopathy slightly better than doctors
- **Google Photos**-automatically can tag photos
- **IBM**-working to detect skin cancer
- **SigTuple**-medical diagnostics from blood smears



SIG { () } TUPLE



- Interpreting the huge amount of **genomic data**: **Deep Genomics**



MERCK

- **Detecting cancer** from blood (**Freenome**), accelerating **Drug discovery** (**Merck**)

- **Speech** recognition : **Google Assistant, Cortana, Siri**



- **Natural Language Processing** : **Google Translate** has been increasing in accuracy



- **Text generation** through Deep Learning: **Legal Zoom** creates documents without lawyers

- **Music composition** using Deep Learning : **Aviva Technologies, Sony**

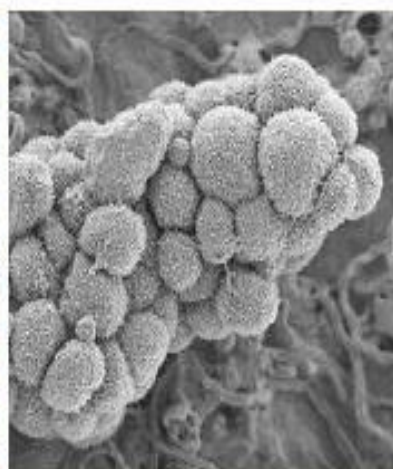


- Improving retail : **AmazonGo**



Deep Learning: Applications

DEEP LEARNING EVERYWHERE



INTERNET & CLOUD

Image Classification
Speech Recognition
Language Translation
Language Processing
Sentiment Analysis
Recommendation

MEDICINE & BIOLOGY

Cancer Cell Detection
Diabetic Grading
Drug Discovery

MEDIA & ENTERTAINMENT

Video Captioning
Video Search
Real Time Translation

SECURITY & DEFENSE

Face Detection
Video Surveillance
Satellite Imagery

AUTONOMOUS MACHINES

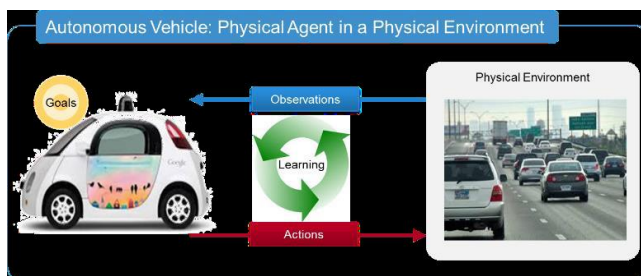
Pedestrian Detection
Lane Tracking
Recognize Traffic Sign

Deep Learning by Accenture



Claim Process Automation

- To detect automatically the amount of damage from car image
- Order spares, settle claim
- Detect fraud



Perception modules process sensory information to

- Recognize road boundaries, recognize pedestrians
- Recognize other vehicles, recognize words in road signs

Video Trawling Analytics System (VTAS)

- Provide a video ingestion and search solution to augment forensic post-event investigations
- Deployed by the Criminal Investigation Department of Singapore Police Force.



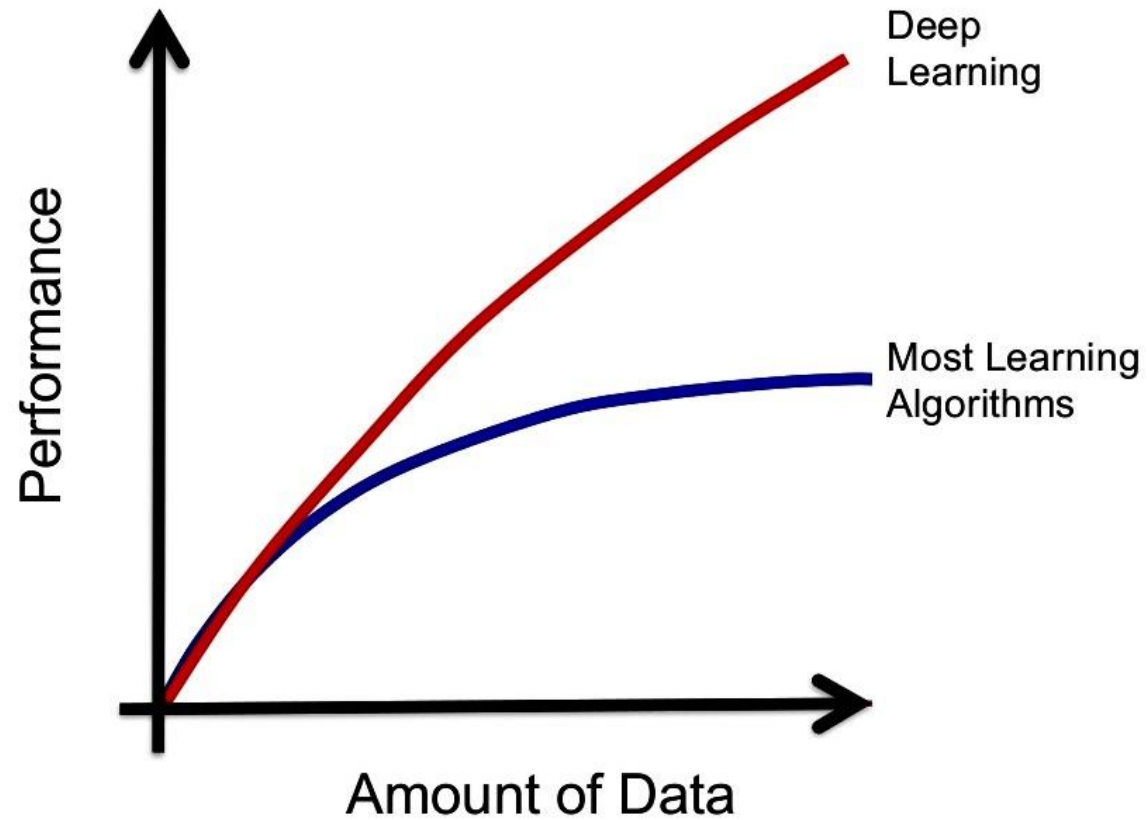
Unique Identity Service Platform

- Automated Passport Control Gates using Face Recognition in London Airports
- Self clearance for EU passport holders in Amsterdam Schiphol



Why Deep Learning

BIG DATA & DEEP LEARNING



Why Deep Learning

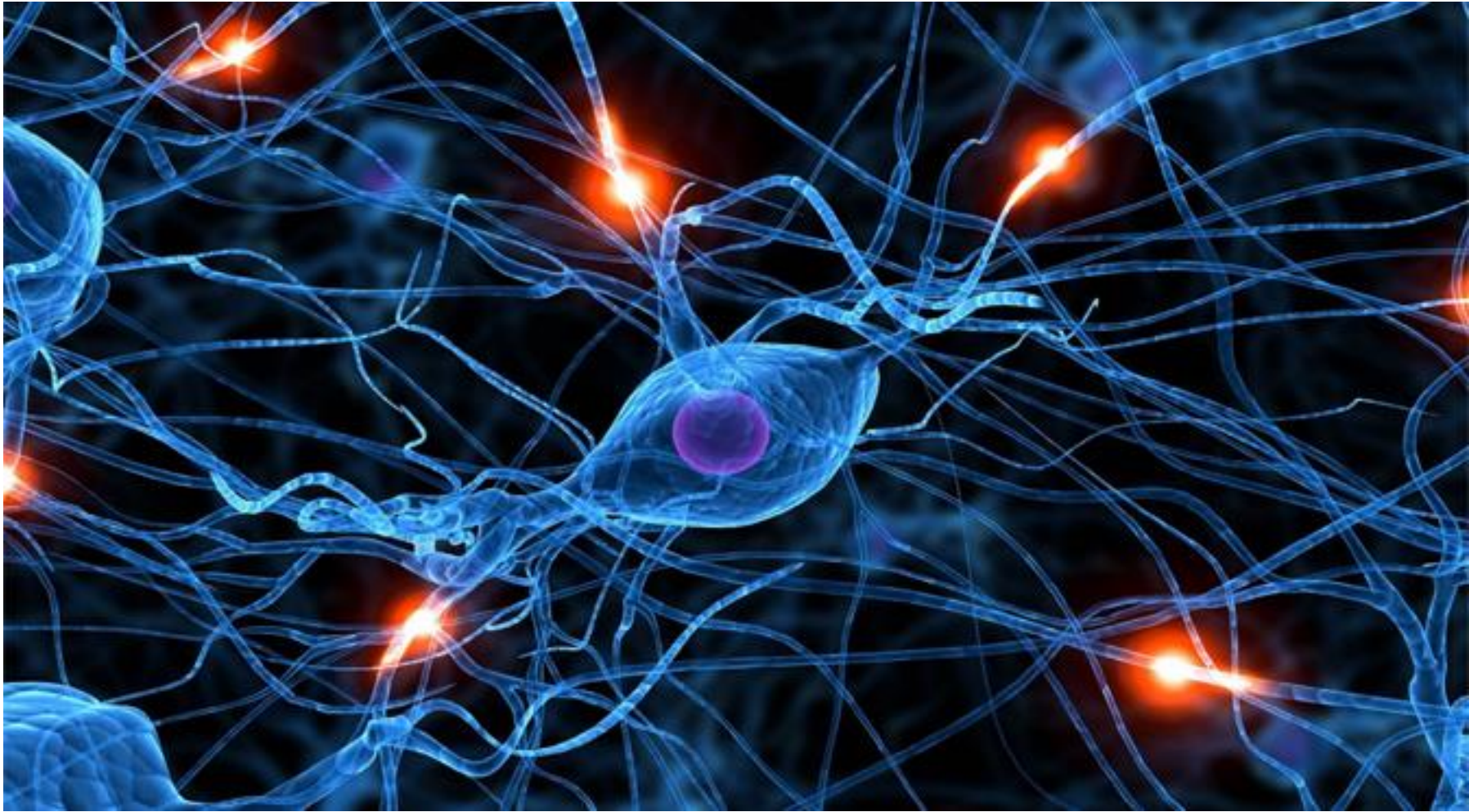
TRADITIONAL MACHINE LEARNING



DEEP LEARNING

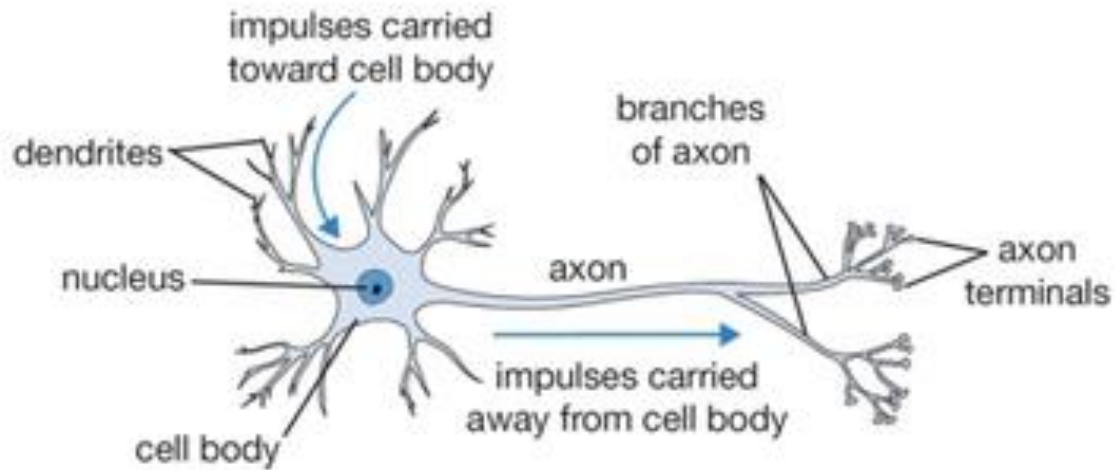


Neural Networks



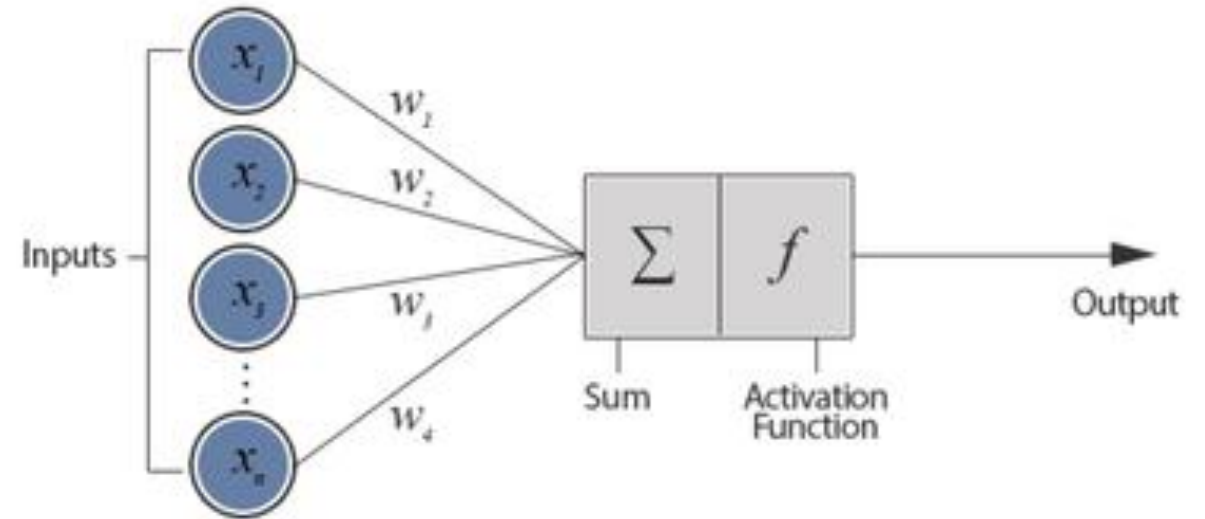
Lets talk technical ...

Biological Inspiration



Input Process

Output

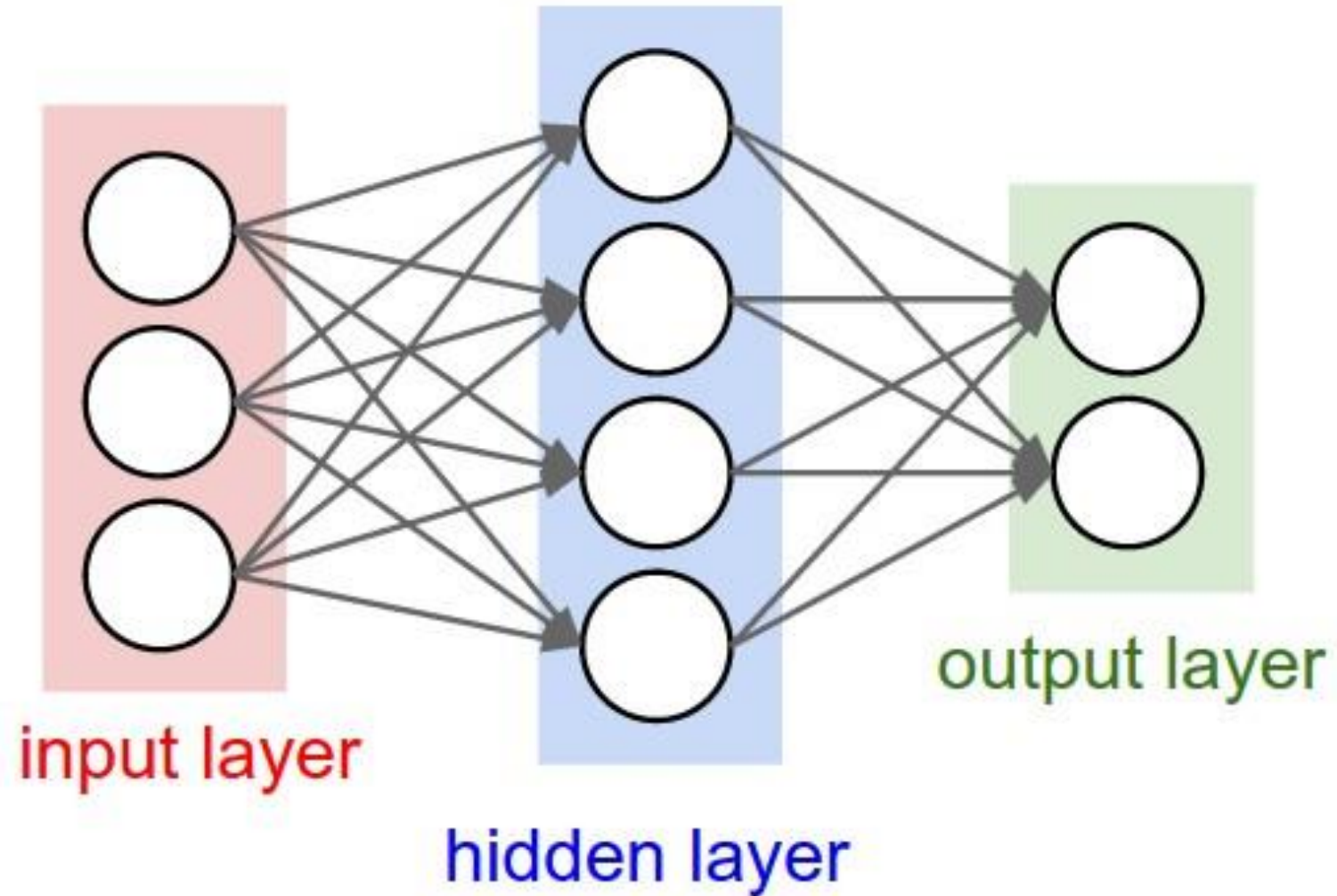


Input

Process

Output


A Neural Network



House Price Prediction Data

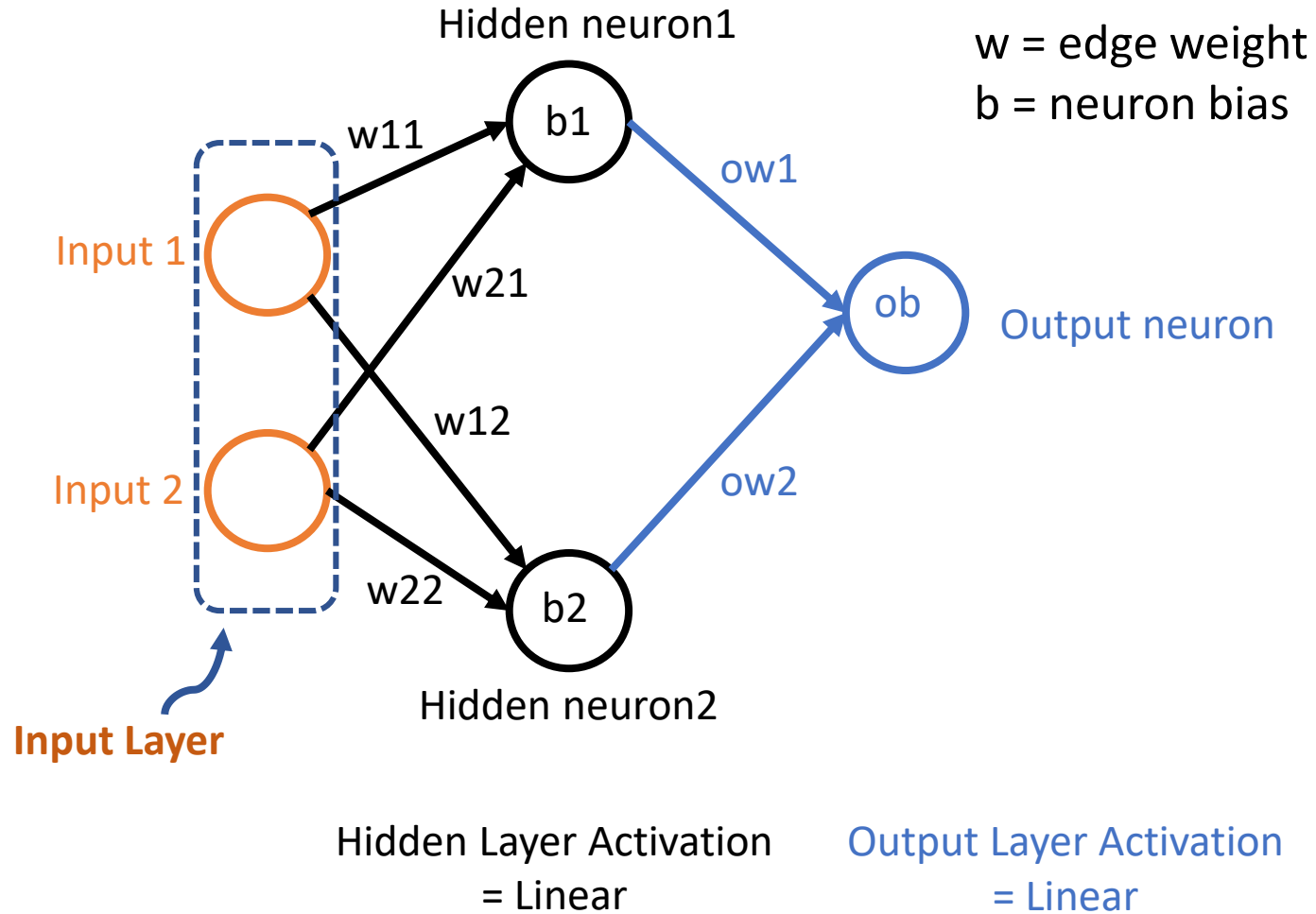
: *Regression Problem*

Problem Statement : To predict House price based on number of bedrooms and floor level



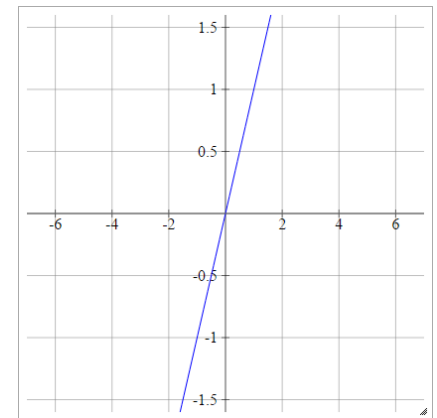
No. of Bedrooms	Floor level	Price (in 1000 of \$)
3	6	300
4	7	400
2	8	350
5	4	375

Regression Model



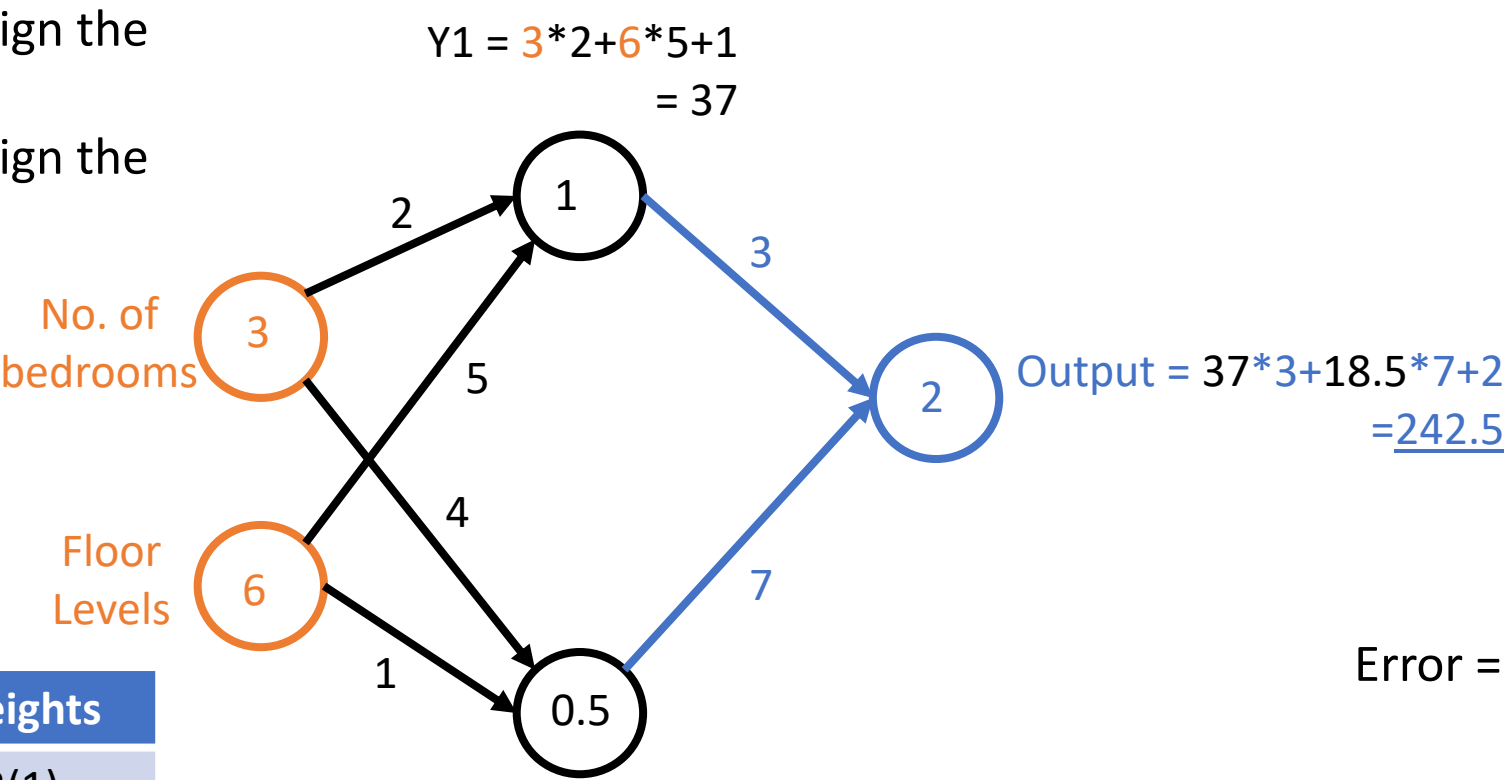
Linear Equation :

$$Y = m * x + b$$



Iteration 1

- Randomly assign the weights
- Randomly assign the bias



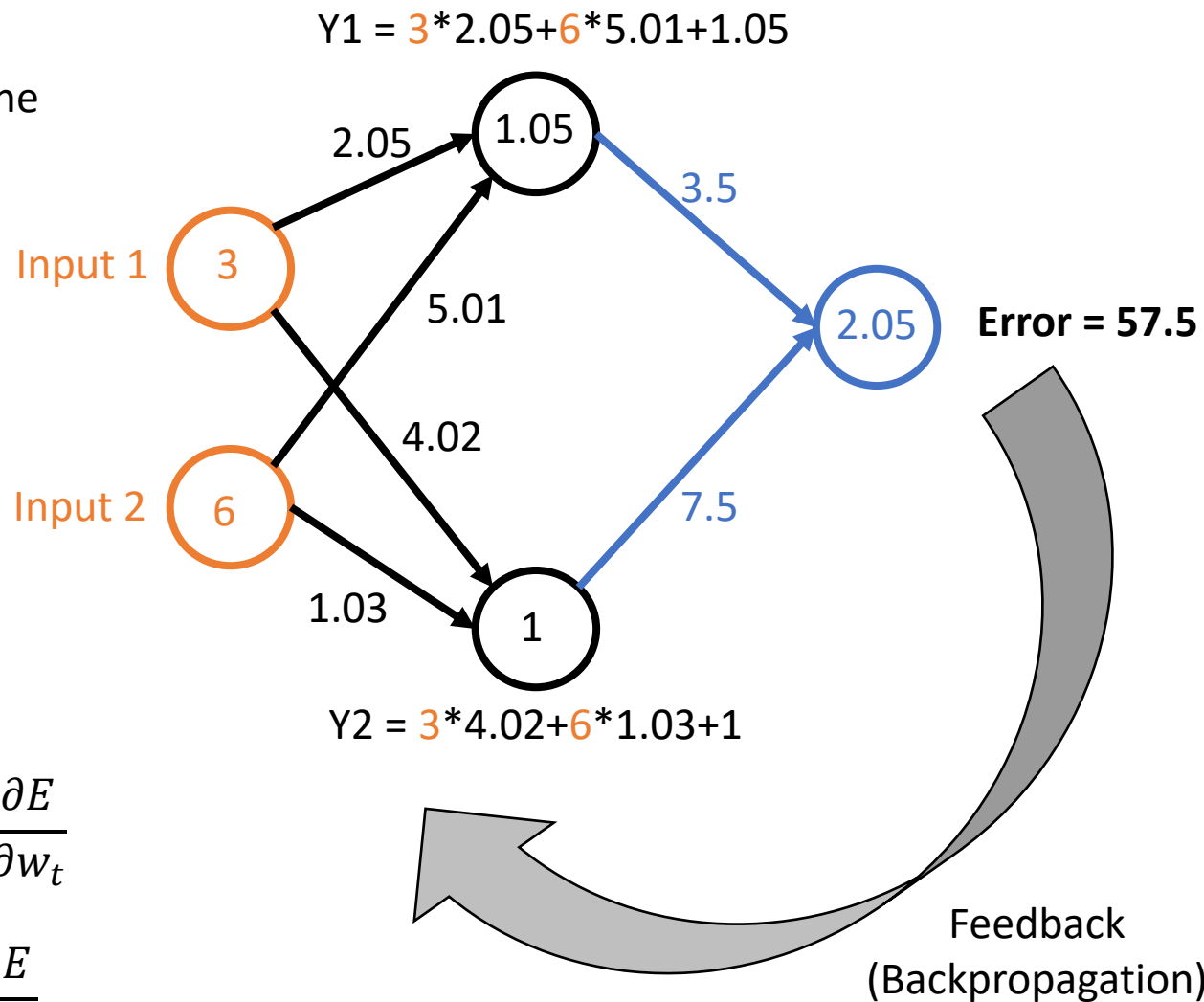
Error = Actual – Predicted
= 300 - 242.5
= 57.5

Input	Weights
3	2(1)
3	4(2)
6	5(1)
6	1(2)
Y1	3
Y2	7

Neuron	Bias
Hidden 1	1
Hidden 2	0.5
Output	2

Iteration 2

Weights and Biases updated for all the neurons based on the error



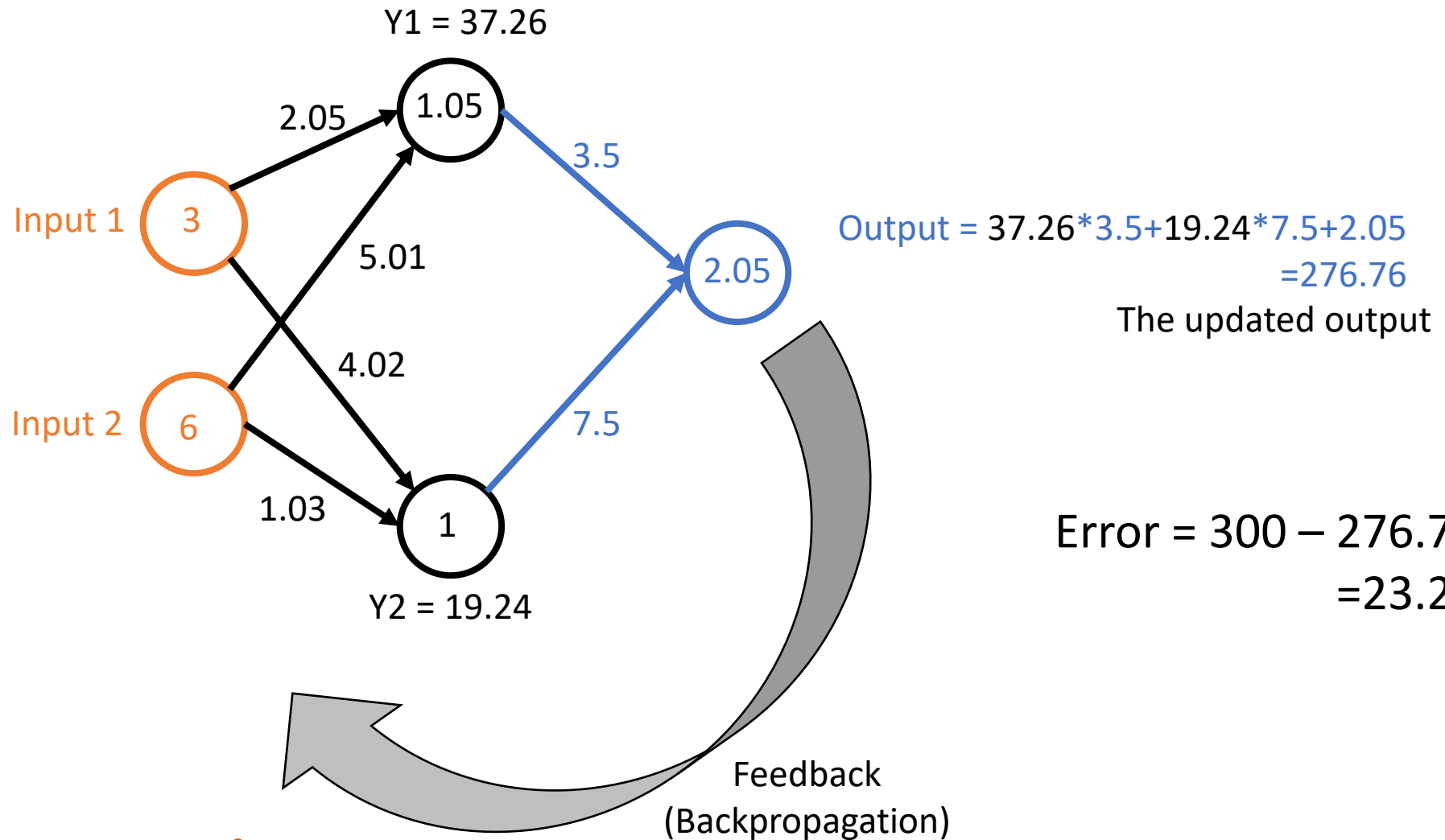
$$w_{t+1} = w_t + \frac{\partial E}{\partial w_t}$$

$$b_{t+1} = b_t + \frac{\partial E}{\partial b_t}$$

Input	Iteration 1 Weights	Iteration 2 Weights
3	2(1)	2.05(1)
3	4(2)	4.02(2)
6	5(1)	5.01(1)
6	1(2)	1.03(2)
Y1	3	3.5
Y2	7	7.5

Neuron	Iteration 1 Bias	Iteration 2 Bias
Hidden 1	1	1.05
Hidden 2	0.5	1
Output	2	2.05

Iteration 2



And the process continues ...

Considering the whole dataset

We considered only one data point for simplicity



No. of Bedrooms	Floor level	Price (in 1000 of \$)
3	6	300
4	7	400
2	8	350
5	4	375

Considering the whole dataset

Actually the whole dataset will be considered for the iterations



No. of Bedrooms	Floor level	Price (in 1000 of \$)
3	6	300
4	7	400
2	8	350
5	4	375

$$Error = \sum_{i=1}^n (Actual - Predicted)$$

Where n = number of rows of data

Image Classification



Labels

cat



dog



cat



dog



Labels

cat



cat



dog

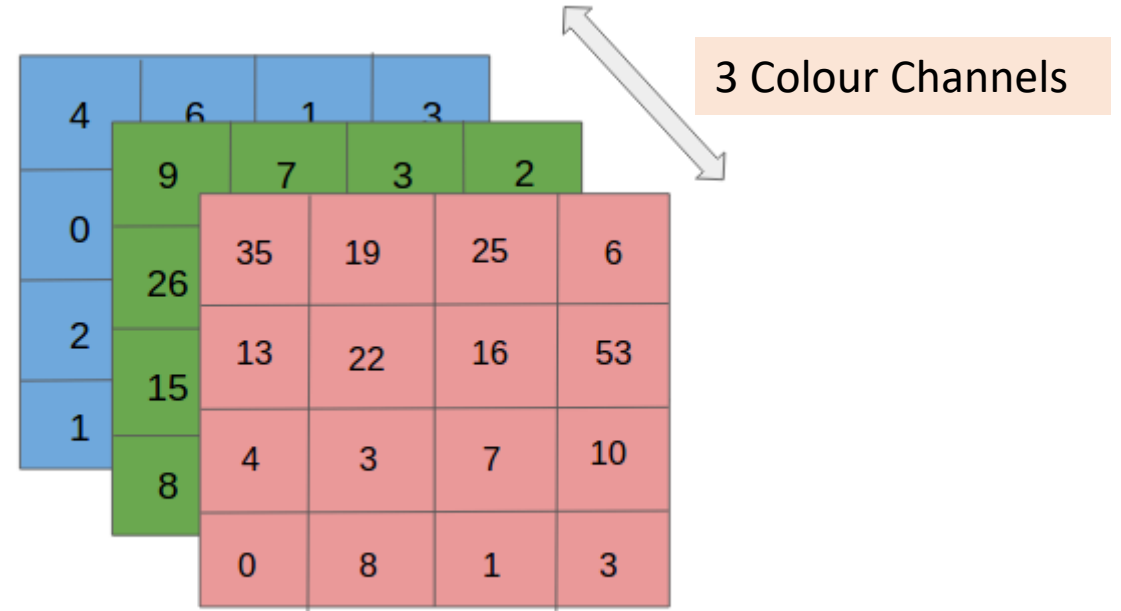


dog

Processing the Data and how the Computer reads it



Original Image



Converted to numbers for the computer algorithm to understand

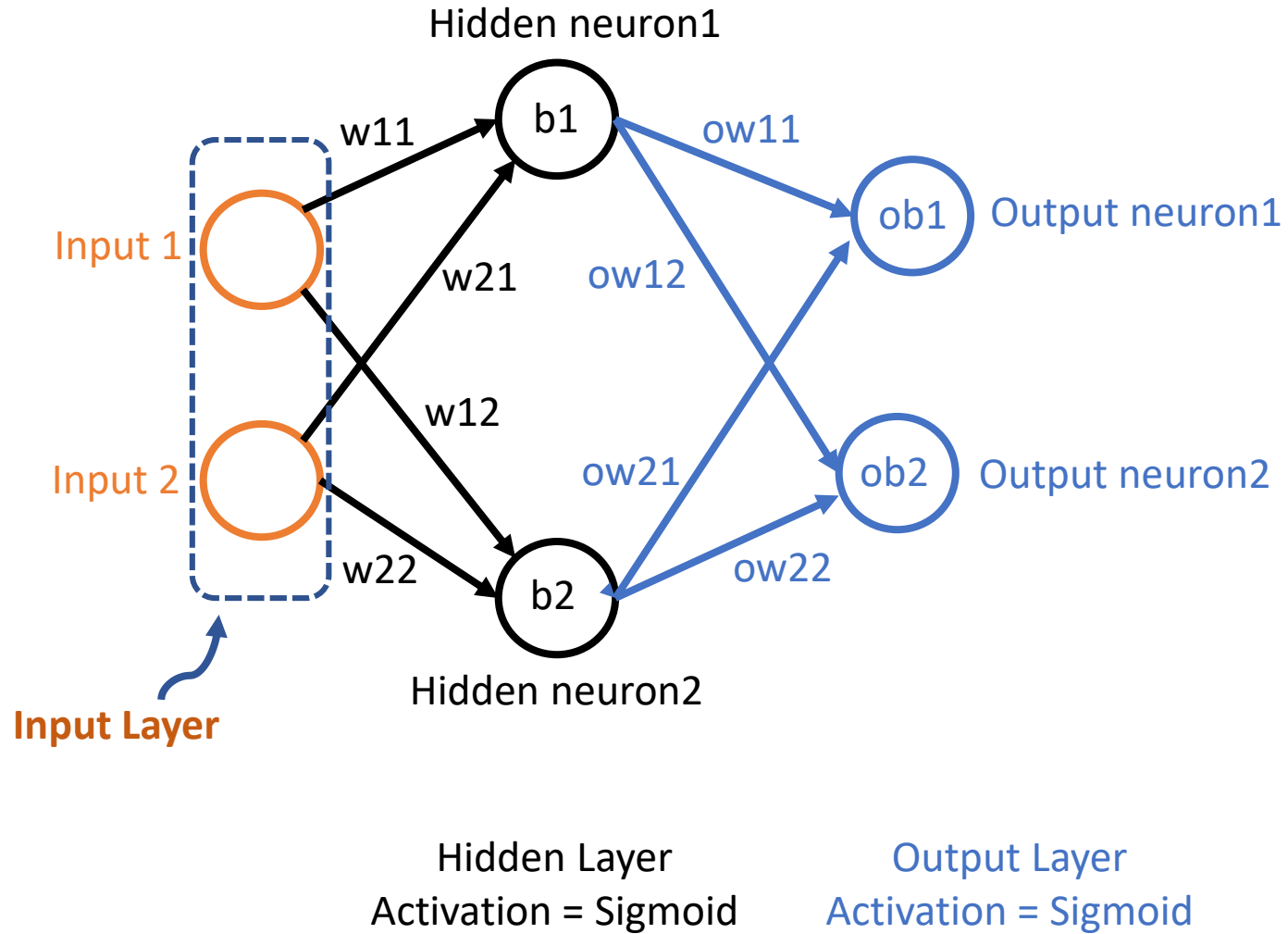
5	6	42
7	10	55



5	6	42	7	10	55
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Flattening the matrix

Classification Model

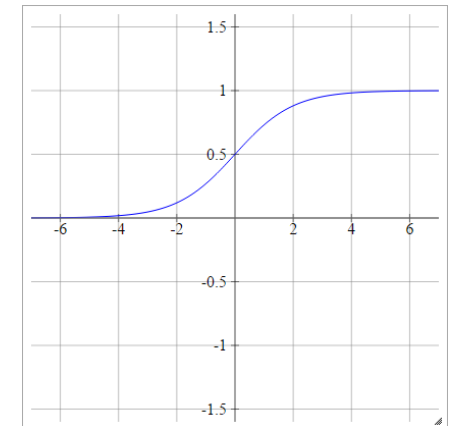


Sigmoid/Logistic Function :

$$Y = 1 / (1 + \exp(-z))$$

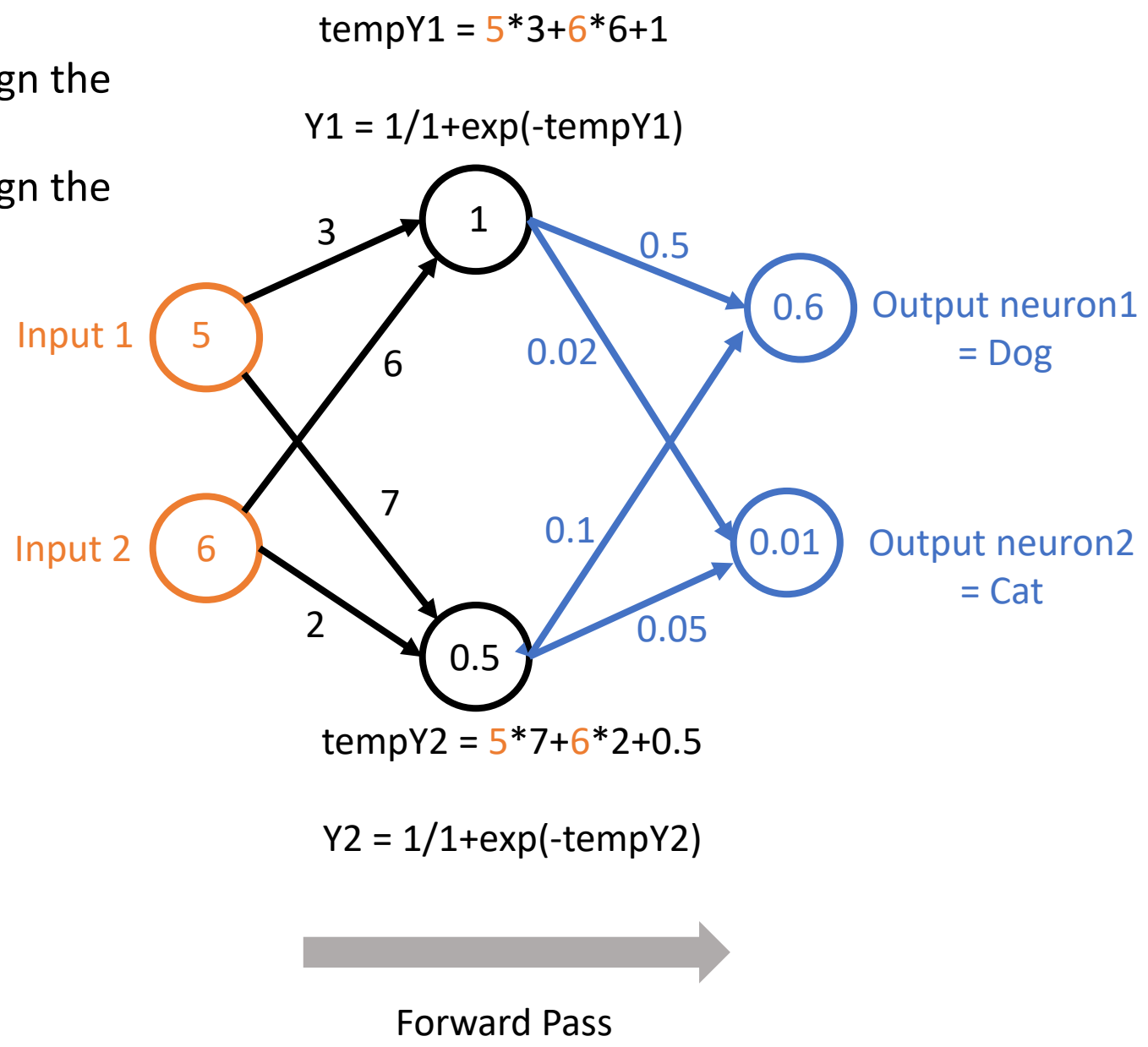
Where

$$z = m * x + b$$



Iteration 1

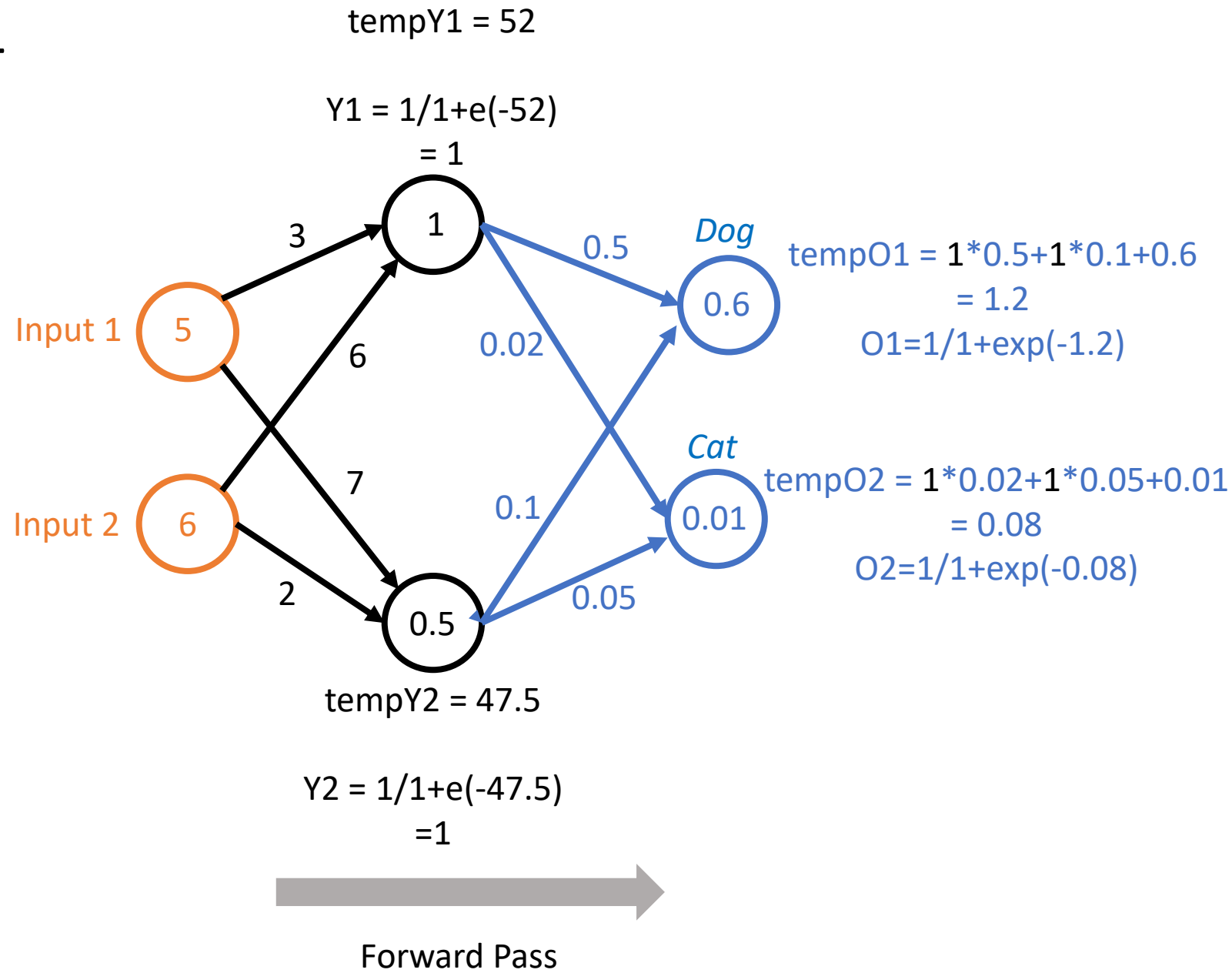
- Randomly assign the weights
- Randomly assign the bias



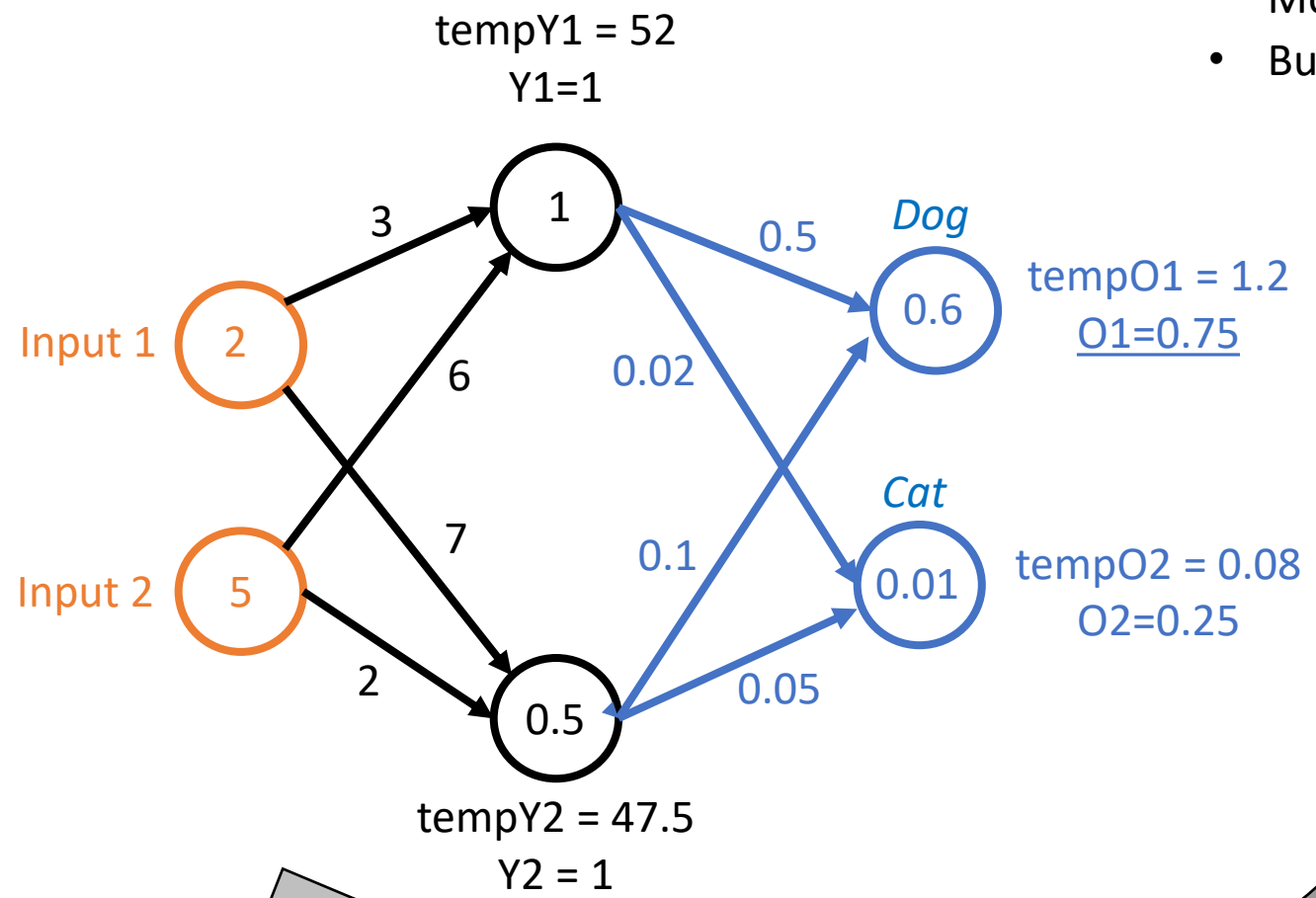
Input	Weights
2	3(1)
2	7(2)
5	6(1)
5	2(2)
Y1	0.5(1)
Y1	0.02(2)
Y2	0.1(1)
Y2	0.05(2)

Neuron	Bias
Hidden 1	1
Hidden 2	0.5
Output 1	0.6
Output 2	0.01

Iteration 1



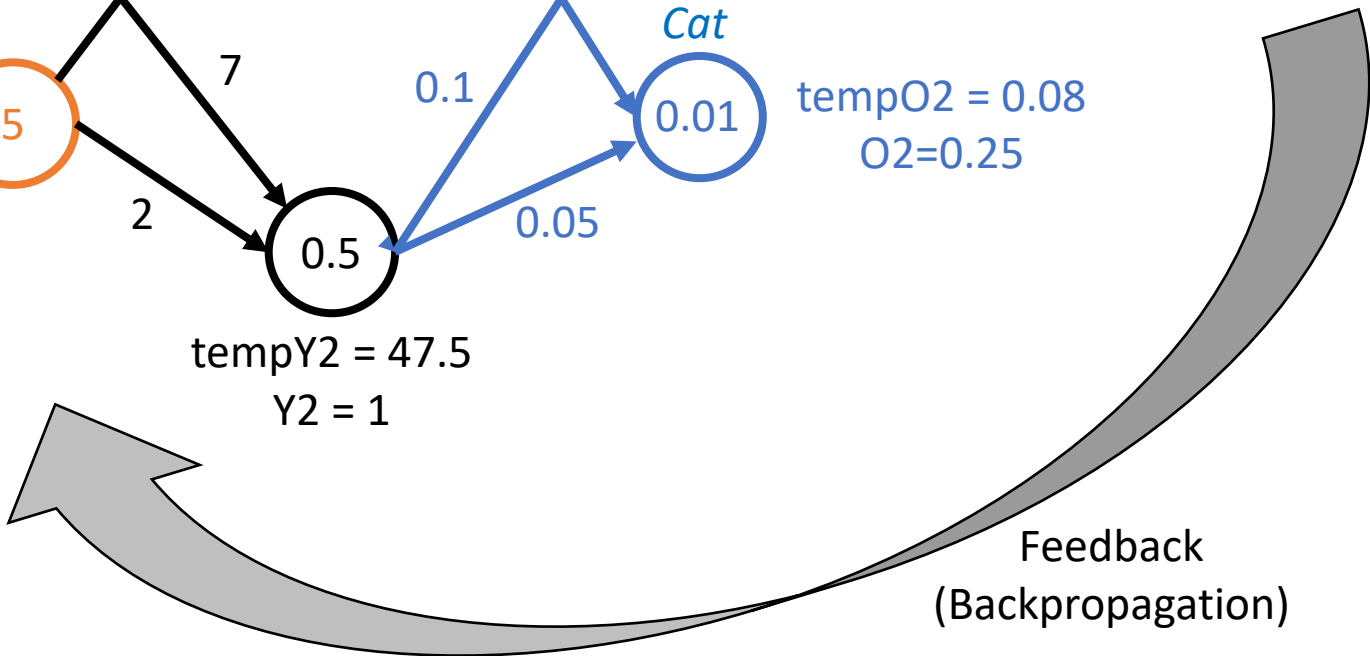
Iteration 1



- More Probability to Output 1 = More probability to Dog
- But the *correct label* was *Cat*



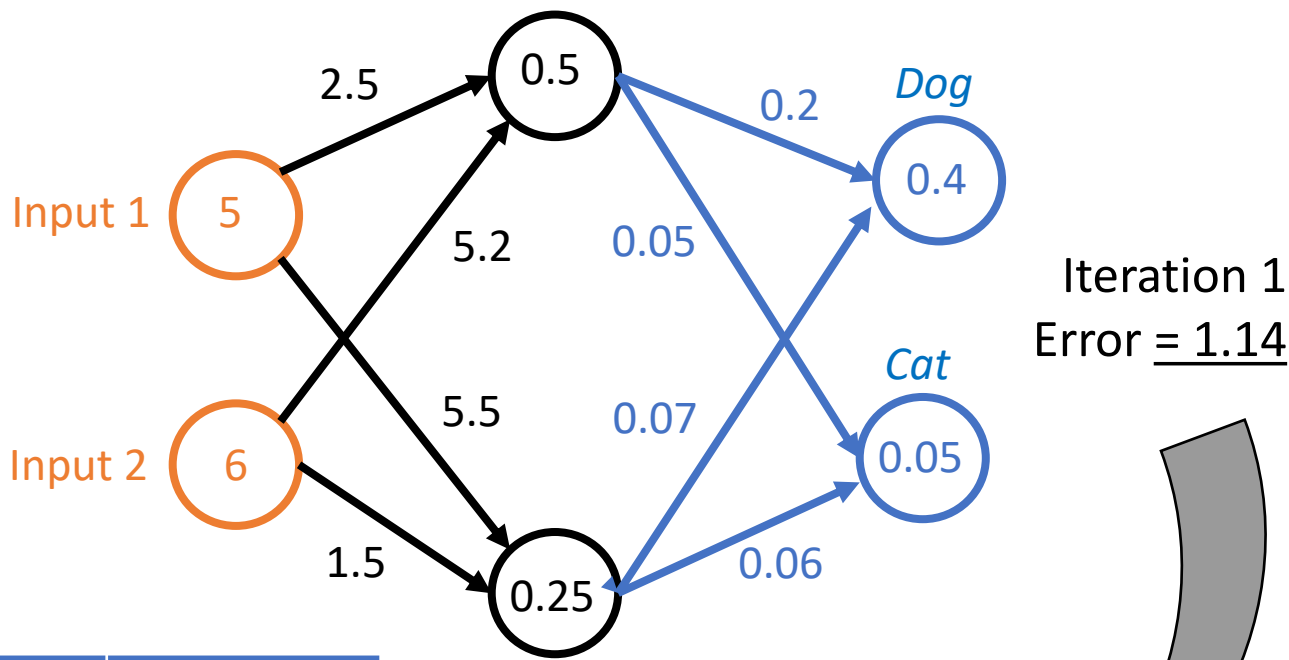
Error = $(0 - 0.75)^2 + (1 - 0.25)^2$
= 1.14



$$w_{t+1} = w_t + \frac{\partial E}{\partial w_t}$$
$$b_{t+1} = b_t + \frac{\partial E}{\partial b_t}$$

Iteration 2

Weights and Biases change according to the error

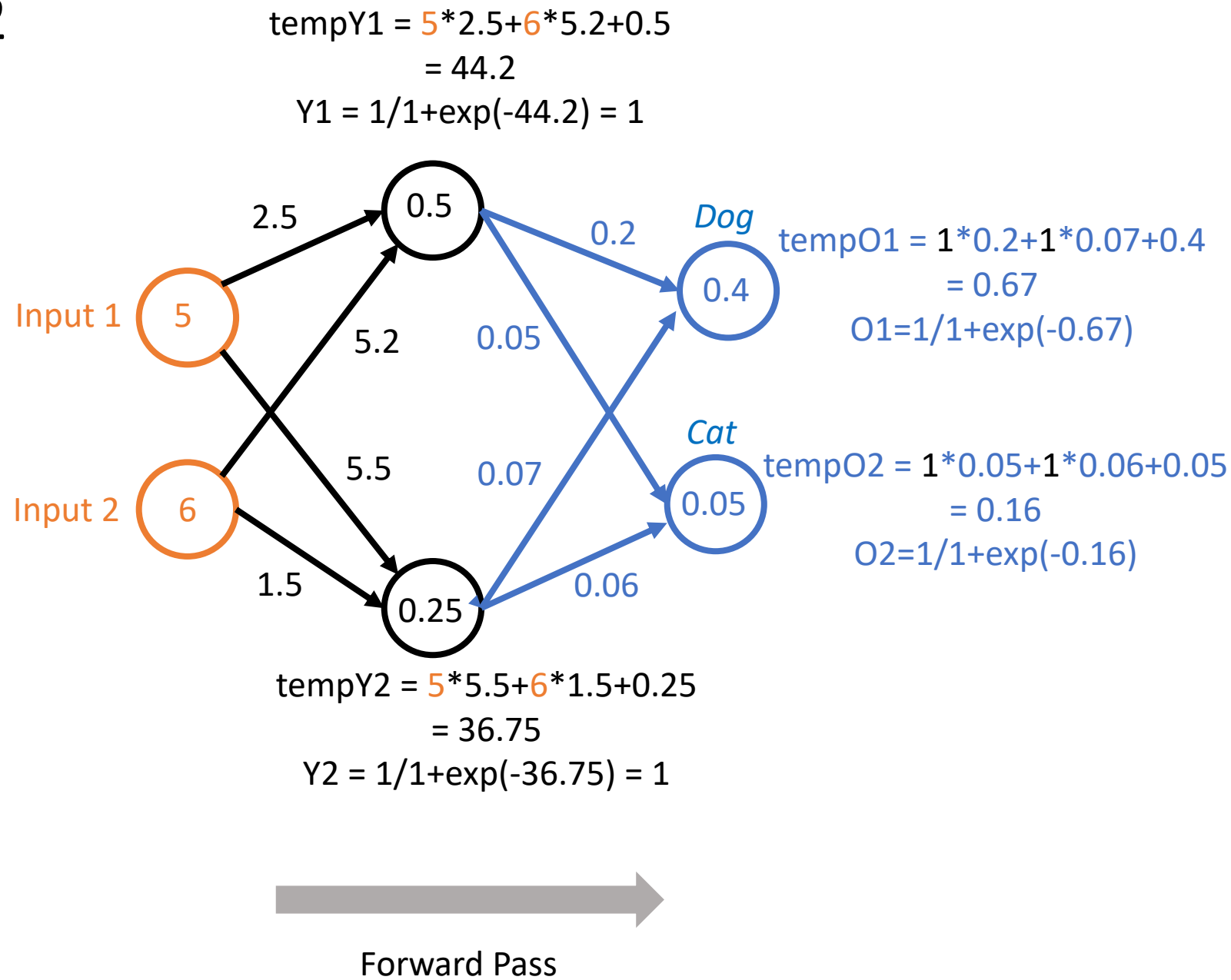


Iteration 1
Error = 1.14

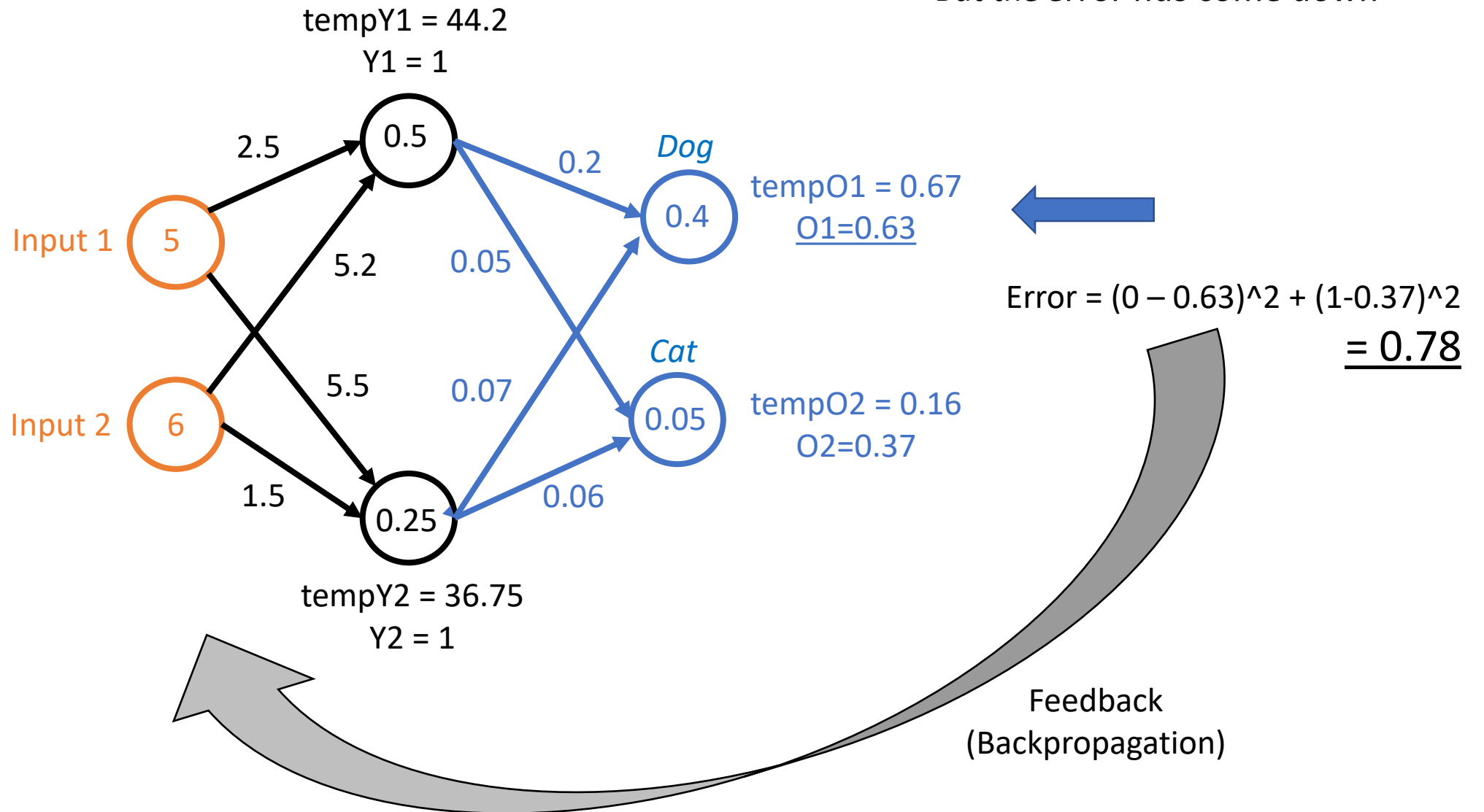
Input	Iteration 1 Weights	Iteration 2 Weights
2	3(1)	2.5(1)
2	7(2)	5.5(2)
5	6(1)	5.2(1)
5	2(2)	1.5(2)
Y1	0.5(1)	0.2(1)
Y1	0.02(2)	0.05(2)
Y2	0.1(1)	0.07(1)
Y2	0.05(2)	0.06(2)

Neuron	Iteration 1 Bias	Iteration 2 Bias
Hidden 1	1	0.5
Hidden 2	0.5	0.25
Output 1	0.6	0.4
Output 2	0.01	0.05

Iteration 2

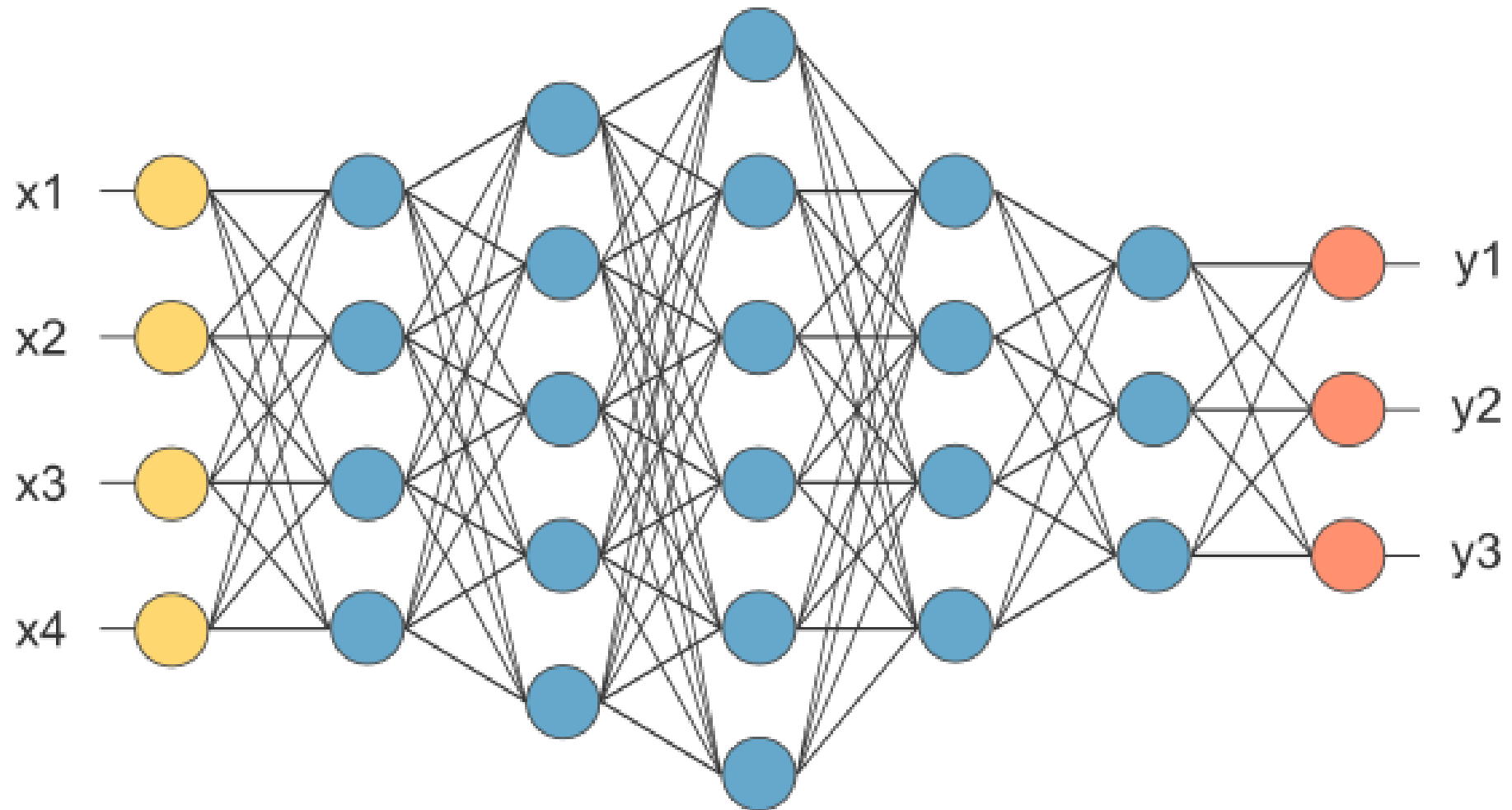


- Still more probability to Dog
- But the *error has come down*



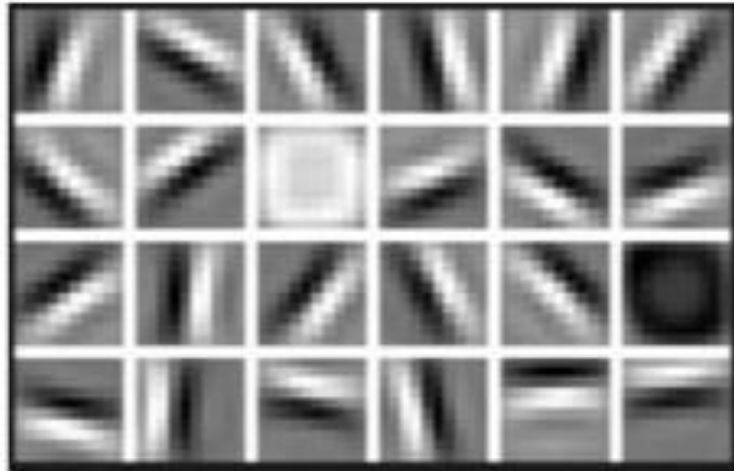
And the process continues ...

A DEEP Neural Network a.k.a. DEEP LEARNING



Feature Representation by Deep Nets

Simple to Complex representation by the different layers



First Layer Representation



Second Layer Representation



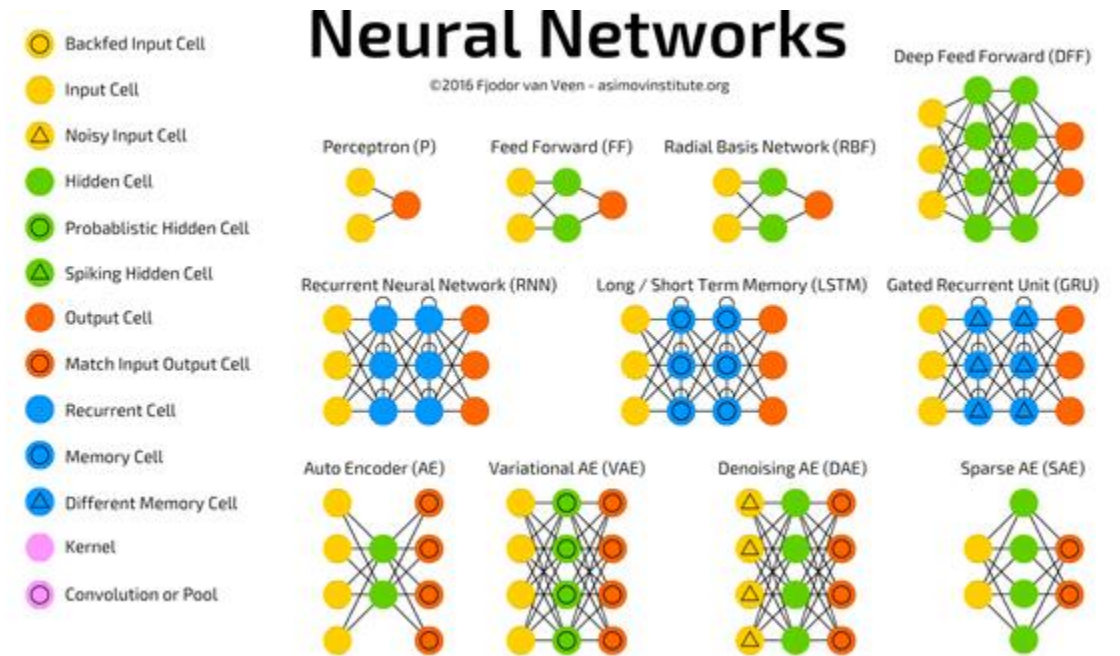
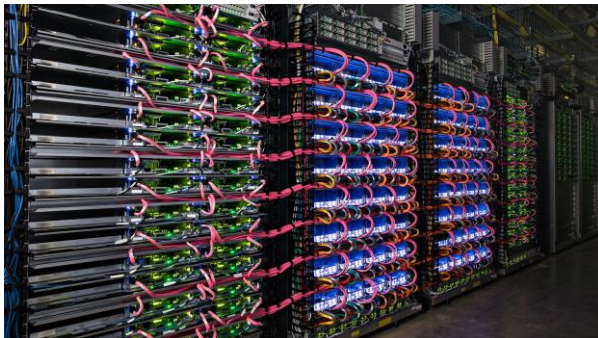
Third Layer Representation

What made Deep Learning possible ...



Lots of
data

Graphics Processing Units (GPUs) and
Tensor Processing Units (TPUs)



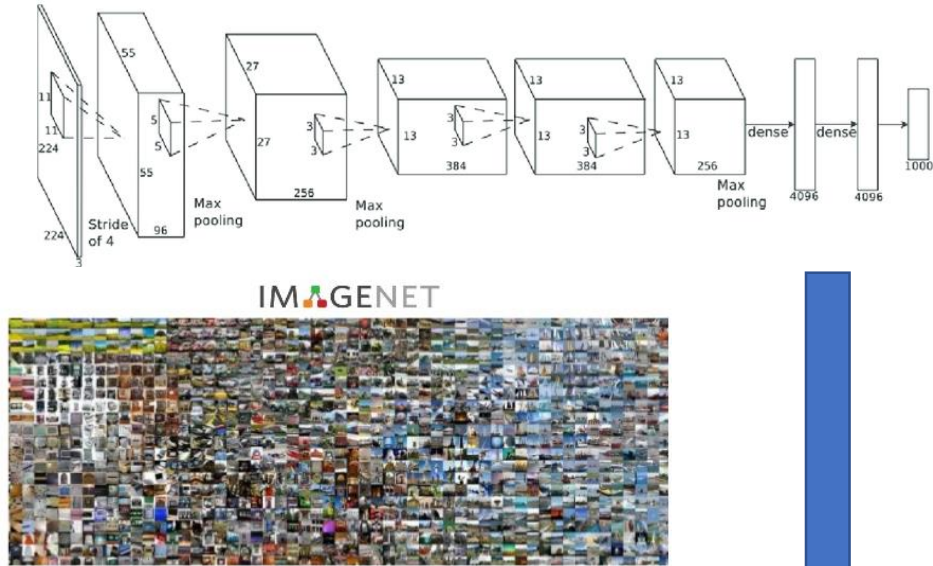
Lots of new and
better algorithms

The Limitations of Deep Learning

- Need for **large, well-labelled** training datasets (for supervised learning)
- For training requires **lots of time and/or money**
GPUs (Graphics Processing Unit) provide significant increase in computing power however are not cheap (thousands of \$)
- The **architecture** of the deep net needs to be optimized for each use case

Transfer Learning

Randomly initialized DeepNet



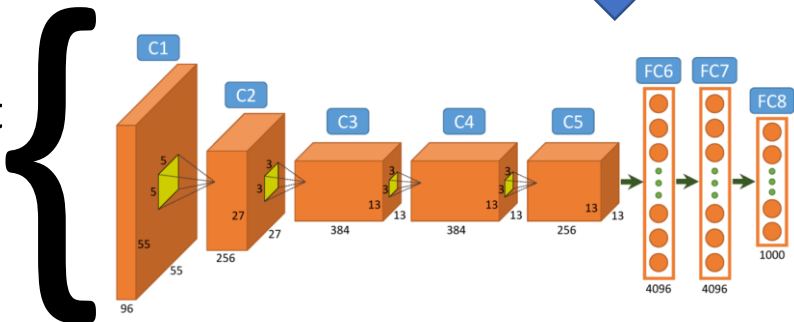
Our data



Target Labels relevant to our data

+
Fine Tuning

This is what
we work
with



Trained with imagenet



The platform for Deep Learning - TensorFlow

What is Tensor Flow ?



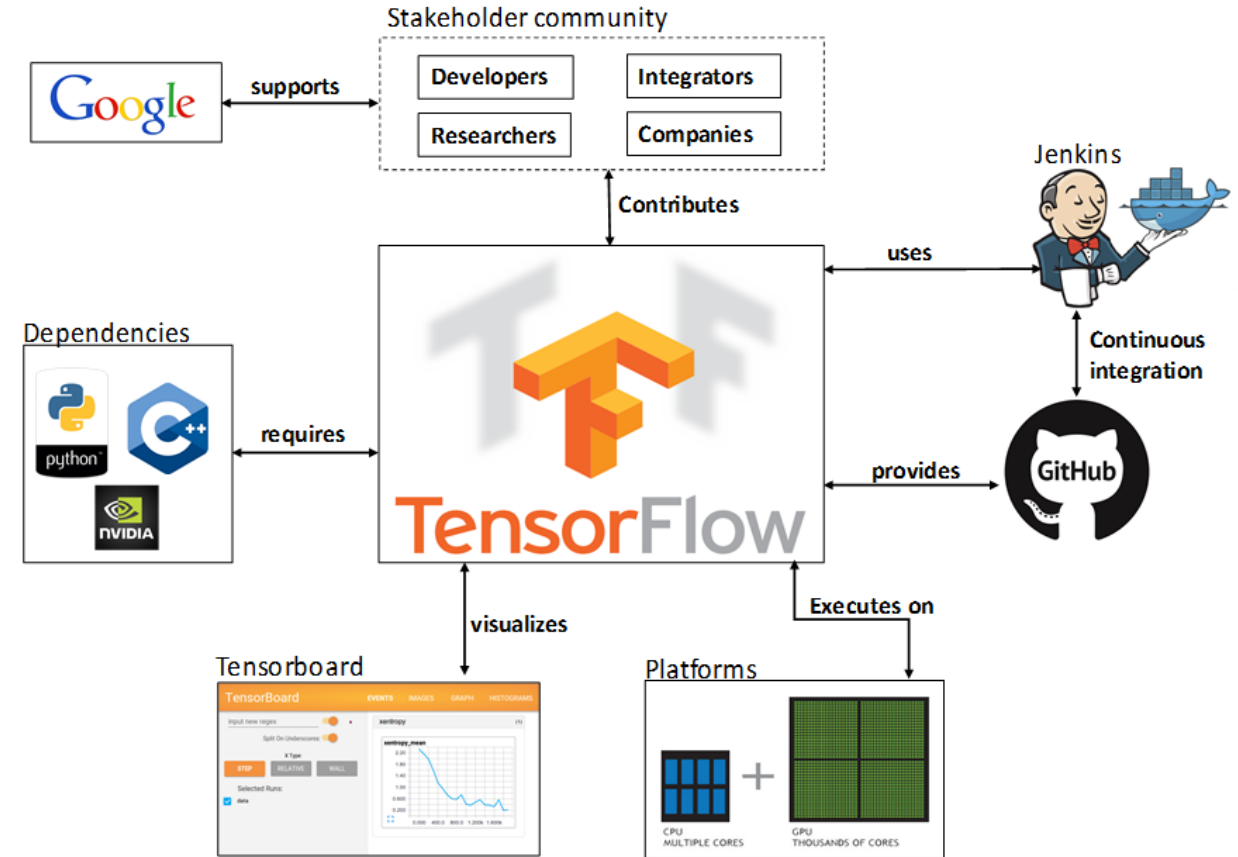
Open Source Python
artificial intelligence
library using data flow
graphs to build models



Helps to create
a deep neural
network
architecture



Used in language
understanding, image
recognition,
classification and
prediction .



**Lets get our hands
dirty...**